Untitled

ref: http://www.sthda.com/english/articles/31-principal-component-methods-in-r-practical-guide/118-principal-component-analysis-in-r-prcomp-vs-princomp/

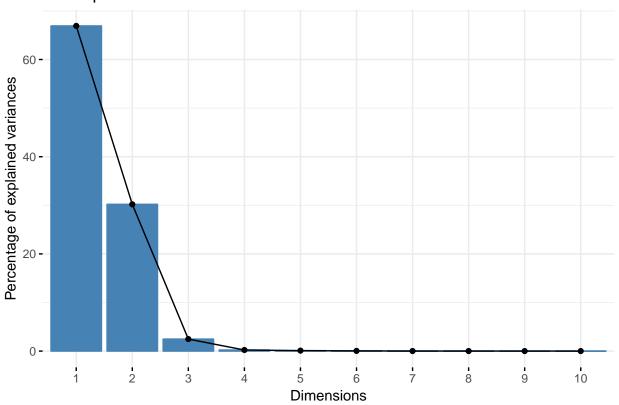
```
library(factoextra)
## Loading required package: ggplot2
## Welcome! Related Books: `Practical Guide To Cluster Analysis in R` at https://goo.gl/13EFCZ
decathlon2.active <-read.csv('../data/select_table.txt',sep = ',',row.names = 1)</pre>
head(decathlon2.active)
##
              time.time.1.month time.time.3.month time.time.6.month
## 2009-01-06
                            0.05
                                              0.14
                                                                 0.31
## 2009-02-06
                            0.21
                                              0.28
                                                                 0.44
## 2009-03-06
                            0.09
                                              0.21
                                                                 0.39
## 2009-04-06
                                              0.20
                                                                 0.40
                            0.16
## 2009-05-06
                            0.14
                                              0.19
                                                                 0.32
## 2009-07-06
                            0.15
                                              0.19
                                                                 0.28
##
              time.time.1.year time.time.2.year time.time.3.year
## 2009-01-06
                          0.45
                                            0.80
                                                              1.10
## 2009-02-06
                                            0.99
                           0.57
                                                              1.44
                                            0.91
## 2009-03-06
                          0.67
                                                              1.34
## 2009-04-06
                          0.60
                                            0.94
                                                              1.37
## 2009-05-06
                                            0.96
                           0.51
                                                              1.43
## 2009-07-06
                          0.48
                                            0.96
                                                              1.48
##
              time.time.5.year time.time.7.year time.time.10.year
## 2009-01-06
                                            2.07
                          1.68
                                                               2.51
                           1.97
## 2009-02-06
                                            2.40
                                                               3.05
## 2009-03-06
                          1.83
                                            2.49
                                                               2.83
## 2009-04-06
                           1.90
                                            2.55
                                                               2.95
## 2009-05-06
                          2.06
                                            2.70
                                                               3.18
## 2009-07-06
                           2.40
                                            3.12
                                                               3.52
##
              time.time.20.year time.time.30.year
## 2009-01-06
                           3.41
                                              3.04
## 2009-02-06
                            3.94
                                              3.70
## 2009-03-06
                            3.74
                                              3.50
## 2009-04-06
                                              3.73
                            3.82
## 2009-05-06
                                              4.09
                            4.12
## 2009-07-06
                            4.29
                                              4.35
res.pca <- princomp(decathlon2.active, scale = TRUE, cor=FALSE)
## Warning: In princomp.default(decathlon2.active, scale = TRUE, cor = FALSE) :
## extra argument 'scale' will be disregarded
summary(res.pca,loadings=TRUE)
## Importance of components:
                                                   Comp.3
                             Comp.1
                                       Comp.2
                                                               Comp.4
                           1.790162 1.2027566 0.34402068 0.103799330
## Standard deviation
## Proportion of Variance 0.669160 0.3020651 0.02471236 0.002249749
## Cumulative Proportion 0.669160 0.9712251 0.99593742 0.998187171
##
                                 Comp.5
                                              Comp.6
                                                            Comp.7
                                                                          Comp.8
```

```
## Standard deviation
                         0.0686055312 0.0436944087 0.0254521666 0.0238024768
## Proportion of Variance 0.0009827959 0.0003986546 0.0001352678 0.0001183013
## Cumulative Proportion 0.9991699670 0.9995686217 0.9997038895 0.9998221908
##
                               Comp.9
                                          Comp.10
                                                       Comp.11
## Standard deviation
                         1.817289e-02 1.764564e-02 1.448882e-02
## Proportion of Variance 6.895936e-05 6.501592e-05 4.383398e-05
## Cumulative Proportion 9.998912e-01 9.999562e-01 1.000000e+00
##
## Loadings:
##
                    Comp.1 Comp.2 Comp.3 Comp.4 Comp.5 Comp.6 Comp.7 Comp.8
## time.time.1.month -0.345 -0.150 0.333 0.405 -0.145 -0.438 0.178 -0.433
## time.time.3.month -0.360 -0.157
                                  0.318
                                         0.255 - 0.169
                                                                     0.277
## time.time.6.month -0.379 -0.164 0.254
                                                       0.313
                                                                     0.387
## time.time.1.year -0.396 -0.151 0.131 -0.311 0.150 0.521
                                                                    -0.213
## time.time.2.year -0.390
                                  ## time.time.3.year
                   -0.370
                                  -0.376 -0.259
                                                      -0.425
                                                              0.190 0.552
## time.time.5.year -0.295
                           0.228 -0.431 0.280
## time.time.7.year -0.227
                            0.350 -0.308
                                         0.305
                                                       0.430 0.316 -0.445
                                                             -0.843
## time.time.10.year -0.145 0.432
                                         0.178 - 0.134
## time.time.20.year
                            0.545
                                  0.318 -0.486 -0.522
                                                              0.257
## time.time.30.year
                            0.489 0.400 0.108 0.729
                                                              0.151 0.101
                    Comp.9 Comp.10 Comp.11
## time.time.1.month 0.366
                                   0.111
## time.time.3.month -0.666 -0.346
## time.time.6.month 0.263 0.404
                                  -0.530
## time.time.1.year
                                   0.602
## time.time.2.year
                     0.182 - 0.567
                                  -0.355
## time.time.3.year
                   -0.380 0.567
## time.time.5.year
                     0.332 - 0.181
                                   0.333
## time.time.7.year -0.210
                                   -0.319
## time.time.10.year 0.103 0.103
## time.time.20.year
                           -0.104
## time.time.30.year
res.pca.loadings<-loadings(res.pca)
res.pca.loadings
##
## Loadings:
                    Comp.1 Comp.2 Comp.3 Comp.4 Comp.5 Comp.6 Comp.7 Comp.8
## time.time.1.month -0.345 -0.150 0.333 0.405 -0.145 -0.438 0.178 -0.433
## time.time.3.month -0.360 -0.157 0.318
                                         0.255 - 0.169
                                                                     0.277
## time.time.6.month -0.379 -0.164 0.254
                                                       0.313
                                                                     0.387
## time.time.1.year -0.396 -0.151 0.131 -0.311 0.150 0.521
                                                                    -0.213
## time.time.2.year -0.390
                                  ## time.time.3.year -0.370
                                  -0.376 -0.259
                                                      -0.425
## time.time.5.year -0.295
                           0.228 - 0.431
                                         0.280
                                                              0.190 0.552
## time.time.7.year -0.227
                                                       0.430 0.316 -0.445
                            0.350 -0.308
                                         0.305
## time.time.10.year -0.145
                           0.432
                                         0.178 - 0.134
                                                             -0.843
## time.time.20.year
                            0.545  0.318  -0.486  -0.522
                                                              0.257
## time.time.30.year
                            0.489
                                  0.400 0.108 0.729
                                                              0.151 0.101
##
                    Comp.9 Comp.10 Comp.11
## time.time.1.month 0.366
                                   0.111
## time.time.3.month -0.666 -0.346
## time.time.6.month 0.263 0.404
                                  -0.530
```

```
0.602
## time.time.1.year
## time.time.2.year
                     0.182 -0.567
                                   -0.355
                    -0.380 0.567
## time.time.3.year
## time.time.5.year
                     0.332 -0.181
                                    0.333
## time.time.7.year
                    -0.210
                                   -0.319
## time.time.10.year 0.103 0.103
## time.time.20.year
                           -0.104
## time.time.30.year
##
##
                 Comp.1 Comp.2 Comp.3 Comp.4 Comp.5 Comp.6 Comp.7 Comp.8
## SS loadings
                  1.000 1.000 1.000 1.000 1.000 1.000
                                                           1.000
## Proportion Var 0.091 0.091 0.091 0.091 0.091
                                                           0.091 0.091
## Cumulative Var
                 0.091 0.182 0.273 0.364 0.455 0.545
                                                           0.636 0.727
##
                 Comp.9 Comp.10 Comp.11
                                  1.000
## SS loadings
                  1.000
                          1.000
                                  0.091
## Proportion Var
                  0.091
                          0.091
## Cumulative Var
                  0.818
                          0.909
                                 1.000
```

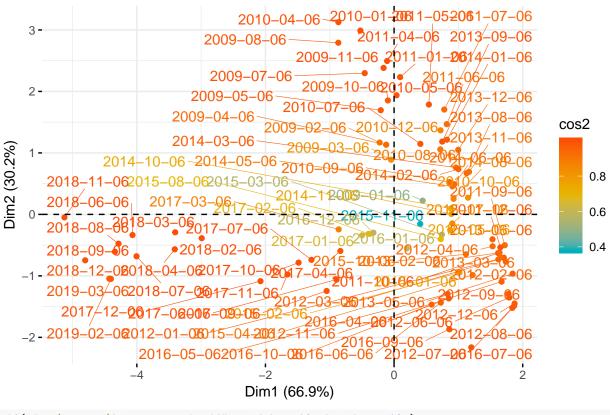
fviz_eig(res.pca)

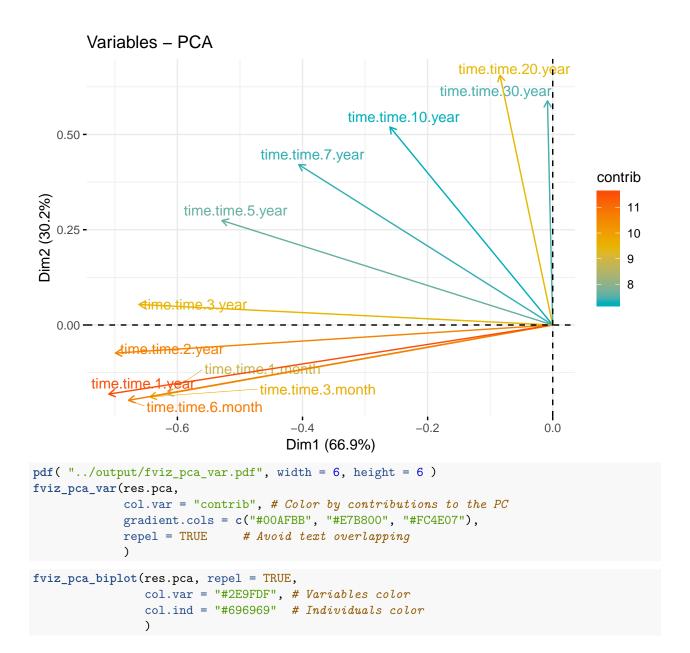
Scree plot



```
pdf( "../output/variance_explained.pdf", width = 6, height = 4 )
fviz_eig(res.pca)
```

Individuals - PCA





```
PCA - Biplot
                                         2010-04-06 2010-01-2011-012061-06-06
                                                                             2014-01-06
                                      2009-07-06
    2 -
                                    2009-05in 06 tin 2009 6 10 a 06
Dim2 (30.2%)
                                       2014-02-06-2014
                                 2009-01-06-2014
                 2018-06-06
       2019-03-062018-07-062017-12-
                                                 -06 2012-020-06 02-06
        2019-02-06 2017-11-06 2017-09-06 2015-04-08016-04096
                            2012-03-06 2016-05-062016-06-06
   -2 -
                                                                  -09-06<sup>2</sup>0126-1027-036-06
                    2015-01-06 2016-10-06 2013-05-06 2016
                                         Dim1 (66.9%)
pdf( "../output/fviz_pca_biplot.pdf", width = 10, height = 10)
fviz_pca_biplot(res.pca, repel = TRUE,
                col.var = "#2E9FDF", # Variables color
                col.ind = "#696969" # Individuals color
# Eigenvalues
eig.val <- get_eigenvalue(res.pca)</pre>
eig.val
##
            eigenvalue variance.percent cumulative.variance.percent
## Dim.1 3.2046816530
                           66.915996197
                                                           66.91600
## Dim.2 1.4466234553
                           30.206510384
                                                           97.12251
## Dim.3 0.1183502273
                            2.471235591
                                                           99.59374
## Dim.4 0.0107743010
                            0.224974946
                                                           99.81872
## Dim.5 0.0047067189
                            0.098279585
                                                           99.91700
## Dim.6 0.0019092013
                            0.039865461
                                                           99.95686
## Dim.7 0.0006478128
                            0.013526784
                                                           99.97039
## Dim.8 0.0005665579
                            0.011830126
                                                           99.98222
## Dim.9 0.0003302541
                            0.006895936
                                                           99.98912
## Dim.10 0.0003113685
                            0.006501592
                                                           99.99562
## Dim.11 0.0002099258
                            0.004383398
                                                          100.00000
# Results for Variables
res.var <- get_pca_var(res.pca)</pre>
res.var$coord
                   # Coordinates
```

Dim.3

Dim.4

Dim.2

Dim.1

##

```
## time.time.1.month -0.61674247 -0.18013186 0.114509498 0.042052805
## time.time.3.month -0.64401561 -0.18891409 0.109300801 0.026506248
## time.time.6.month -0.67823056 -0.19777334 0.087264336 -0.003856864
## time.time.1.year -0.70967366 -0.18131880 0.045158072 -0.032310132
## time.time.2.year -0.69904015 -0.07373328 -0.052611726 -0.040840291
## time.time.3.year
                   ## time.time.5.year
                                0.27428122 -0.148109890 0.029049813
                   -0.52892676
## time.time.7.year -0.40604835
                                0.42091550 -0.105999908 0.031651417
## time.time.10.year -0.26021543 0.51959646 0.004648119 0.018427857
## time.time.20.year -0.08443907 0.65554616 0.109316061 -0.050446616
## time.time.30.year -0.00840166  0.58825108  0.137662771  0.011219593
                           Dim.5
                                        Dim.6
                                                     Dim.7
## time.time.1.month -0.009978656 -0.019153869 0.0045376023 -0.0102950503
## time.time.3.month -0.011589519 -0.002031973 -0.0022364408 0.0065942062
## time.time.6.month -0.003499373 0.013674122 0.0006795216 0.0092016109
## time.time.1.year 0.010293922 0.022786591 -0.0005418448 -0.0050711733
## time.time.2.year
                     0.021160793 -0.009758297 -0.0038729577 -0.0031186222
## time.time.3.year
                     0.002909750 -0.018564017 0.0006716758 -0.0008160353
                   -0.002089225 -0.001747287 0.0048356562 0.0131275931
## time.time.5.year
## time.time.7.year -0.004740159 0.018767019 0.0080528435 -0.0105985411
## time.time.10.year -0.009209845 0.001845165 -0.0214557860 -0.0021796374
## time.time.20.year -0.035827058 -0.004312083 0.0065339912 0.0010363395
## time.time.30.year 0.050031378 -0.003858966 0.0038391846 0.0024125782
                            Dim.9
                                         Dim.10
                                                      Dim.11
## time.time.1.month 0.0066442307
                                  0.0013346692 0.0016123740
## time.time.3.month -0.0121079994 -0.0061028772 0.0004706368
## time.time.6.month 0.0047747727
                                  0.0071315884 -0.0076753292
## time.time.1.year
                    0.0007688094 0.0006698822 0.0087227505
## time.time.2.year
                     0.0032992898 -0.0100041559 -0.0051397762
## time.time.3.year
                   -0.0069076077 0.0100020584 0.0007744912
## time.time.5.year
                     0.0060424591 -0.0031860813
                                                0.0048285862
## time.time.7.year
                   -0.0038235598 -0.0011754595 -0.0046236455
## time.time.10.year
                     0.0018677798 0.0018228371
## time.time.20.year
                     0.0007465671 -0.0018323914
                                                0.0004149755
## time.time.30.year -0.0015289984 0.0016420116
                                                0.0003479210
res.var$contrib
                      # Contributions to the PCs
                           Dim.1
                                     Dim.2
                                                 Dim.3
## time.time.1.month 11.869237268 2.2429809 11.07934098 16.4134863
## time.time.3.month 12.942193783 2.4670230 10.09433218
## time.time.6.month 14.353896823
                                 2.7038338
                                            6.43434705
                                                        0.1380637
## time.time.1.year 15.715654568
                                 2.2726375
                                            1.72306508
                                                       9.6892097
## time.time.2.year
                    15.248227019
                                 0.3758128
                                           2.33881576 15.4806276
## time.time.3.year
                    13.658528447
                                 0.2004255 14.17290267
                                                        6.6872260
## time.time.5.year
                     8.729837859 5.2003986 18.53527458
                                                        7.8324493
## time.time.7.year
                     5.144824933 12.2471301 9.49383939
                                                        9.2981643
## time.time.10.year
                     2.112911006 18.6628028 0.01825515
## time.time.20.year
                     0.222485645 29.7064706 10.09715102 23.6197325
## time.time.30.year
                     0.002202649 23.9204844 16.01267614
                                                       1.1683289
                          Dim.5
                                     Dim.6
                                                Dim.7
                                                           Dim.8
                                                                      Dim.9
## time.time.1.month
                     2.11556237 19.2159248
                                           3.17836189 18.7073659 13.3672249
## time.time.3.month
                     2.85372802 0.2162640
                                           0.77208530 7.6750418 44.3911735
## time.time.6.month 0.26017295 9.7937078 0.07127824 14.9445700
```

2.25135240 27.1961218 0.04532109 4.5391298 0.1789737

time.time.1.year

```
## time.time.2.year
                   9.51361635 4.9876540 2.31545310 1.7166480 3.2960423
## time.time.3.year
                   0.17988422 18.0506231 0.06964179 0.1175367 14.4479814
## time.time.5.year
                   ## time.time.7.year
                   0.47738376\ 18.4475561\ 10.01034396\ 19.8265832
## time.time.10.year
                   1.0563387
## time.time.20.year 27.27118597 0.9739180 6.59033627 0.1895657
                                                            0.1687678
## time.time.30.year 53.18224594 0.7799922 2.27524661 1.0273501 0.7078902
                      Dim.10
                                 Dim.11
## time.time.1.month 0.5721010 1.23841375
## time.time.3.month 11.9617475
                            0.10551298
## time.time.6.month 16.3342016 28.06262013
## time.time.1.year
                   0.1441193 36.24441505
## time.time.2.year
                 32.1429897 12.58411333
                  32.1295127 0.28573747
## time.time.3.year
## time.time.5.year
                   3.2601612 11.10642208
## time.time.7.year
                   0.4437524 10.18364497
## time.time.10.year
                  1.0671392 0.04942626
## time.time.20.year
                   1.0783552
                            0.08203122
## time.time.30.year
                   0.8659200 0.05766277
```

res.var\$cos2 # Quality of representation

```
Dim.1
                                       Dim.2
                                                     Dim.3
## time.time.1.month 3.803713e-01 0.032447487 1.311243e-02 0.0017684384
## time.time.3.month 4.147561e-01 0.035688534 1.194667e-02 0.0007025812
## time.time.6.month 4.599967e-01 0.039114294 7.615064e-03 0.0000148754
## time.time.1.year 5.036367e-01 0.032876507 2.039251e-03 0.0010439446
## time.time.2.year 4.886571e-01 0.005436597 2.767994e-03 0.0016679294
## time.time.3.year 4.377124e-01 0.002899402 1.677366e-02 0.0007205019
## time.time.5.year 2.797635e-01 0.075230185 2.193654e-02 0.0008438917
## time.time.7.year 1.648753e-01 0.177169857 1.123598e-02 0.0010018122
## time.time.10.year 6.771207e-02 0.269980483 2.160501e-05 0.0003395859
## time.time.20.year 7.129957e-03 0.429740771 1.195000e-02 0.0025448611
## time.time.30.year 7.058789e-05 0.346039338 1.895104e-02 0.0001258793
                            Dim.5
                                         Dim.6
                                                      Dim.7
## time.time.1.month 9.957357e-05 3.668707e-04 2.058983e-05 1.059881e-04
## time.time.3.month 1.343170e-04 4.128915e-06 5.001667e-06 4.348356e-05
## time.time.6.month 1.224561e-05 1.869816e-04 4.617495e-07 8.466964e-05
## time.time.1.year 1.059648e-04 5.192287e-04 2.935958e-07 2.571680e-05
## time.time.2.year 4.477792e-04 9.522436e-05 1.499980e-05 9.725805e-06
## time.time.3.year 8.466644e-06 3.446227e-04 4.511484e-07 6.659136e-07
## time.time.5.year 4.364860e-06 3.053012e-06 2.338357e-05 1.723337e-04
## time.time.7.year 2.246911e-05 3.522010e-04 6.484829e-05 1.123291e-04
## time.time.10.year 8.482125e-05 3.404635e-06 4.603508e-04 4.750819e-06
## time.time.20.year 1.283578e-03 1.859406e-05 4.269304e-05 1.074000e-06
## time.time.30.year 2.503139e-03 1.489162e-05 1.473934e-05 5.820533e-06
##
                            Dim.9
                                        Dim.10
## time.time.1.month 4.414580e-05 1.781342e-06 2.599750e-06
## time.time.3.month 1.466036e-04 3.724511e-05 2.214990e-07
## time.time.6.month 2.279845e-05 5.085955e-05 5.891068e-05
## time.time.1.year 5.910679e-07 4.487422e-07 7.608638e-05
## time.time.2.year 1.088531e-05 1.000831e-04 2.641730e-05
## time.time.3.year 4.771504e-05 1.000412e-04 5.998367e-07
## time.time.5.year 3.651131e-05 1.015111e-05 2.331524e-05
## time.time.7.year 1.461961e-05 1.381705e-06 2.137810e-05
```

```
## time.time.10.year 3.488601e-06 3.322735e-06 1.037585e-07
## time.time.20.year 5.573624e-07 3.357658e-06 1.722047e-07
## time.time.30.year 2.337836e-06 2.696202e-06 1.210490e-07
# Results for individuals
res.ind <- get_pca_ind(res.pca)
res.ind$coord
                       # Coordinates
                    Dim.1
                                 Dim. 2
                                             Dim.3
## 2009-01-06 0.44482285
                          0.224148077 -0.22963989 -0.3003600455
## 2009-02-06 -0.22446372
                          1.168870742 -0.02695049 -0.3132367669
## 2009-03-06 -0.04713997
                           0.889115890 -0.15282173 -0.3268743727
## 2009-04-06 -0.12308685
                          1.133509069 -0.08477844 -0.2540416033
                          1.694181260 -0.02497588 -0.2326333233
## 2009-05-06 -0.20716526
## 2009-07-06 -0.45642511
                           2.297239708 -0.16769053 -0.0016186262
## 2009-08-06 -0.86714738
                          2.791753206 -0.40266565 -0.0488608879
## 2009-10-06 -0.09605865
                          1.852929456 -0.30713816 -0.0711472337
## 2009-11-06 -0.16281518
                          2.382519933 -0.12914790 -0.0418915583
## 2010-01-06 -0.52359515
                           2.989528123 -0.24349432 -0.0532187591
## 2010-04-06 -0.86608537
                           3.126391795 -0.19623809 -0.0157241755
## 2010-05-06 0.03849672
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2012-03-06

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## 2016-07-06 0.0088394221 -0.0061968738
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## 2016-12-06 -0.0362935972 0.0064460872 0.0044876609
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## 2017-02-06 -0.0103318196 -0.0173882405 -0.0085163354
## 2017-03-06 -0.0634715466 -0.0149154844 -0.0229109735
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## 2017-06-06 -0.0272059124 -0.0124777752 -0.0183782220
## 2017-07-06 -0.0175093309 0.0023393488 -0.0129943560
## 2017-09-06  0.0081205365  0.0079369066  0.0033873940
## 2017-10-06 0.0316958727 -0.0142803916 -0.0062797428
## 2017-11-06 -0.0218200335 -0.0243941962
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## 2017-12-06
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## 2018-02-06
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## 2018-04-06 0.0311390739 0.0033915293 -0.0089491146
## 2018-06-06 -0.0036311295 -0.0057472593 -0.0075082617
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## 2018-08-06 -0.0023301087 -0.0098954912 -0.0043362099

## 2018-09-06 -0.0119656454 -0.0064799751 0.0057671997

## 2018-11-06 -0.0111978678 -0.0026411665 -0.0054394123

## 2018-12-06 0.0146120519 0.0111725089 0.0122742453

## 2019-02-06 0.0054587066 0.0090288618 0.0057973907

## 2019-03-06 -0.0121043183 0.0011895639 -0.0199691462
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res.ind\$contrib # Contributions to the PCs

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                                               Dim.3
                                                            Dim.4
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## 2009-03-06 0.0007791187 6.140040e-01 0.2217231941 1.114250e+01
## 2009-04-06 0.0053118816 9.979401e-01 0.0682357194 6.730240e+00
## 2009-05-06 0.0150473134 2.229329e+00 0.0059221923 5.643711e+00
## 2009-07-06 0.0730405721 4.098898e+00 0.2669672530 2.732210e-04
## 2009-08-06 0.2636397765 6.053528e+00 1.5393241105 2.489680e-01
## 2009-10-06 0.0032351773 2.666688e+00 0.8955883943 5.278821e-01
## 2009-11-06 0.0092942613 4.408873e+00 0.1583491082 1.830096e-01
## 2010-01-06 0.0961205687 6.941603e+00 0.5628835571 2.953591e-01
## 2010-04-06 0.2629943994 7.591739e+00 0.3656011236 2.578438e-02
## 2010-05-06 0.0005196042 2.914313e+00 0.1011882689 2.820162e-01
## 2010-07-06 0.0585846461 1.022030e+00 0.2075709919 2.017657e-01
## 2010-08-06 0.1814141096 8.686035e-01 1.7343506962 4.763247e-02
## 2010-09-06 0.2591820591 2.143857e-01 0.7212611895 7.614824e-02
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## 2011-01-06 0.0031109315 3.870754e+00 0.6194142320 3.371035e-01
## 2011-04-06 0.0040838203 4.834216e+00 0.0254877125 2.934046e-02
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## 2009-03-06 7.446565e+00 9.3047190569 2.585346e+00 6.408842e+00
## 2009-04-06 1.606355e+00 1.0644635841 2.286124e+00 4.641176e+00
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## 2010-05-06 4.220214e-03 0.6767732722 1.121273e+01 1.076846e+00
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## 2011-04-06 2.751338e+00 1.3759149740 1.581982e-01 3.358335e+00
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## 2015-08-06 2.680266e-01 0.1297121205 2.195417e-01 1.614292e-02
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## 2016-01-06 4.900243e+00 0.8473101573 7.318497e-01 5.071104e-02
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## 2009-03-06 6.876471e+00
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## 2011-10-06 5.009390e-01
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## 2012-01-06 1.324753e-02 0.250921541 0.058539380
```

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## 2012-04-06 7.978350e-02
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## 2012-07-06 2.725497e-02
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## 2012-08-06 8.881423e-01
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## 2012-09-06 9.345559e-02
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## 2012-11-06 5.097667e-02
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## 2013-05-06 2.813996e-01
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## 2014-03-06 8.698838e-01
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## 2014-05-06 7.001760e-01
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## 2014-06-06 4.435056e-01
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## 2014-08-06 2.502511e-01
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## 2014-11-06 5.040857e-01
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                            0.168640354
## 2015-05-06 5.522264e-02
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## 2015-07-06 2.910133e-02
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## 2016-07-06 2.658334e-01
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## 2017-02-06 3.631746e-01
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## 2017-03-06 1.370629e+01
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## 2017-04-06 4.178331e+00
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## 2017-06-06 2.518190e+00
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## 2017-07-06 1.043040e+00
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## 2017-09-06 2.243527e-01
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## 2017-10-06 3.417962e+00
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## 2017-11-06 1.619842e+00
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## 2017-12-06 2.857825e-02
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## 2018-02-06 1.253082e+00
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                                          0.025241047
## 2018-03-06 8.802377e-02 0.180512633
                                         0.055792541
```

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## 2018-04-06 3.298931e+00 0.041507494 0.428651478
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## 2018-07-06 1.806620e-03 0.125478392
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## 2018-08-06 1.847201e-02 0.353354048
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## 2018-09-06 4.871179e-01
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                                        0.178022203
## 2018-11-06 4.266115e-01
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                                       0.158360965
## 2018-12-06 7.264141e-01 0.450439821
                                        0.806368933
## 2019-02-06 1.013774e-01 0.294172026 0.179890955
## 2019-03-06 4.984740e-01 0.005106354 2.134337925
```

res.ind\$cos2 # Quality of representation

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                                 Dim.2
                                              Dim.3
                                                           Dim.4
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## 2009-03-06 0.002273332 8.087254e-01 2.389211e-02 1.093065e-01 3.191160e-02
## 2009-04-06 0.010927666 9.267319e-01 5.184120e-03 4.654937e-02 4.853487e-03
## 2009-05-06 0.014431500 9.651557e-01 2.097583e-04 1.819791e-02 1.136676e-04
## 2009-07-06 0.037750279 9.562990e-01 5.095634e-03 4.747601e-07 3.453317e-06
## 2009-08-06 0.086227369 8.937444e-01 1.859296e-02 2.737676e-04 2.114036e-04
## 2009-10-06 0.002602512 9.683616e-01 2.660648e-02 1.427696e-03 2.985000e-05
## 2009-11-06 0.004632552 9.919815e-01 2.914776e-03 3.066786e-04 6.369075e-06
## 2010-01-06 0.029548143 9.632616e-01 6.390232e-03 3.052590e-04 4.274440e-04
## 2010-04-06 0.070868611 9.234626e-01 3.638305e-03 2.335976e-05 1.522028e-03
## 2010-05-06 0.000392444 9.936007e-01 2.822406e-03 7.161159e-04 4.681369e-06
## 2010-07-06 0.110767949 8.722977e-01 1.449376e-02 1.282572e-03 8.773223e-04
## 2010-08-06 0.284230633 6.143163e-01 1.003508e-01 2.509037e-04 4.486216e-04
## 2010-09-06 0.676328265 2.525335e-01 6.950713e-02 6.680618e-04 1.786275e-04
## 2010-10-06 0.779466488 4.363826e-02 1.735021e-01 1.258781e-03 9.235276e-04
## 2010-12-06 0.188527184 6.747141e-01 1.343528e-01 7.830320e-05 8.787463e-04
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## 2011-04-06 0.001862328 9.951449e-01 4.292445e-04 4.498428e-05 1.842752e-03
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## 2011-09-06 0.863872455 7.322150e-02 6.074039e-02 3.486420e-04 5.927630e-04
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## 2018-04-06 0.972749986 2.694683e-02 9.820468e-05 7.782596e-05 1.191429e-05
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## 2009-04-06 1.304598e-03 9.506999e-04 1.687977e-03 1.051324e-04
## 2009-05-06 6.459150e-04 7.499711e-04 2.713592e-05 2.908572e-04
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## 2012-03-06 3.771437e-05 1.662518e-04 4.707913e-05 5.794914e-08
## 2012-04-06 6.901228e-05 3.958794e-04 3.405723e-05 8.379305e-06
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## 2012-07-06 3.231691e-04 3.208634e-05 3.356342e-05 1.383938e-06
## 2012-08-06 8.808681e-05 3.545422e-05 6.279404e-05 4.513431e-05
## 2012-09-06 2.890588e-04 6.314467e-06 2.334125e-05 5.528704e-06
## 2012-11-06 9.972236e-04 9.685176e-06 3.222912e-05 3.618522e-06
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## 2013-02-06 2.187388e-04 1.158288e-04 4.833926e-06 2.044736e-06
## 2013-03-06 6.123952e-04 3.955223e-09 5.121036e-06 3.647512e-05
## 2013-05-06 3.793698e-04 2.242686e-08 1.338750e-04 1.846874e-05
## 2013-06-06 5.338487e-04 1.240284e-04 1.570760e-04 6.436929e-06
## 2013-08-06 6.247239e-04 1.753736e-04 1.701995e-05 1.222250e-04
## 2013-09-06 1.074386e-05 6.984427e-05 9.976614e-05 1.009037e-05
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