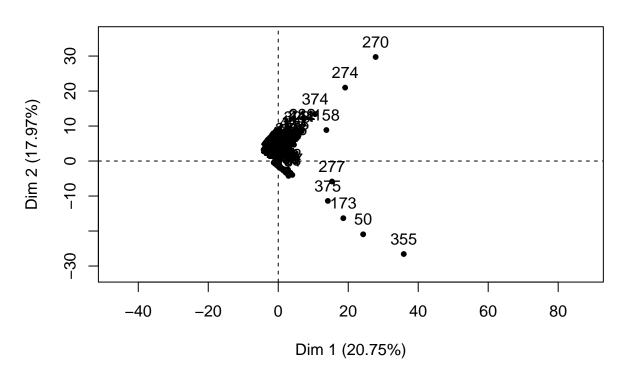
classifier

```
# library(caret)
library(knitr)
# library(e1071)
library(FactoMineR) #for PCA
library(MASS) # for stepwise
library(caTools) # for sample
library(DAAG) # for cv
## Loading required package: lattice
##
## Attaching package: 'DAAG'
## The following object is masked from 'package:MASS':
##
##
       hills
data = read.csv("/Users/yihuifu/GitHub/FB NoUse/ego_alter.csv",header = TRUE,sep = ",")
friended = data[,55]
friended = factor(friended)
x = data[,0:50] # Remove names and ids
new_data = cbind(x,friended)
# summary(new_data)
pca = PCA(x)
```

Individuals factor map (PCA)

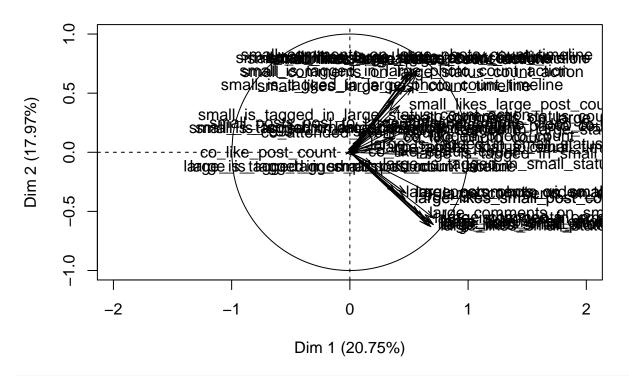


```
## Warning in arrows(0, 0, coord.var[v, 1], coord.var[v, 2], length = 0.1, :
## zero-length arrow is of indeterminate angle and so skipped

## Warning in arrows(0, 0, coord.var[v, 1], coord.var[v, 2], length = 0.1, :
## zero-length arrow is of indeterminate angle and so skipped

## Warning in arrows(0, 0, coord.var[v, 1], coord.var[v, 2], length = 0.1, :
## zero-length arrow is of indeterminate angle and so skipped
```

Variables factor map (PCA)



pca\$eig

```
eigenvalue percentage of variance
           9.750894e+00
                                   2.074658e+01
   comp 1
   comp 2
           8.444943e+00
                                   1.796796e+01
           4.617337e+00
                                   9.824122e+00
           2.971970e+00
                                   6.323340e+00
   comp 4
   comp 5
           2.413280e+00
                                   5.134637e+00
   comp 6
           1.926525e+00
                                   4.098990e+00
           1.836554e+00
                                   3.907562e+00
                                   3.449248e+00
   comp 8
           1.621146e+00
   comp 9
           1.387590e+00
                                   2.952320e+00
   comp 10 1.282460e+00
                                   2.728638e+00
   comp 11 1.137808e+00
                                   2.420867e+00
                                   2.152149e+00
## comp 12 1.011510e+00
## comp 13 9.955679e-01
                                   2.118230e+00
## comp 14 9.094168e-01
                                   1.934929e+00
                                   1.892784e+00
## comp 15 8.896083e-01
                                   1.653533e+00
## comp 16 7.771604e-01
```

```
## comp 17 7.143252e-01
                                  1.519841e+00
## comp 18 6.118030e-01
                                  1.301709e+00
## comp 19 5.645815e-01
                                  1.201237e+00
## comp 20 4.924438e-01
                                  1.047753e+00
## comp 21 4.373362e-01
                                  9.305026e-01
## comp 22 4.071027e-01
                                  8.661759e-01
## comp 23 3.519043e-01
                                  7.487325e-01
## comp 24 3.209081e-01
                                  6.827832e-01
## comp 25 2.792195e-01
                                  5.940840e-01
## comp 26 2.226316e-01
                                  4.736842e-01
## comp 27 2.063245e-01
                                  4.389884e-01
## comp 28 1.535099e-01
                                   3.266169e-01
## comp 29 1.065366e-01
                                  2.266736e-01
## comp 30 7.750801e-02
                                  1.649107e-01
## comp 31 2.693222e-02
                                  5.730260e-02
## comp 32 2.142727e-02
                                  4.558993e-02
## comp 33 7.949117e-03
                                  1.691302e-02
## comp 34 5.861736e-03
                                  1.247178e-02
## comp 35 4.361017e-03
                                  9.278760e-03
## comp 36 3.881254e-03
                                  8.257988e-03
## comp 37 2.852639e-03
                                  6.069446e-03
## comp 38 2.741356e-03
                                  5.832672e-03
## comp 39 1.988518e-03
                                  4.230889e-03
## comp 40 1.149952e-03
                                  2.446707e-03
## comp 41 8.113375e-04
                                  1.726250e-03
## comp 42 1.383203e-04
                                  2.942986e-04
## comp 43 9.228788e-29
                                  1.963572e-28
## comp 44 2.103502e-29
                                   4.475537e-29
## comp 45 1.455633e-29
                                  3.097092e-29
## comp 46 7.110492e-30
                                  1.512871e-29
## comp 47 4.631576e-30
                                   9.854418e-30
## comp 48 1.614879e-31
                                   3.435914e-31
## comp 49 4.517702e-32
                                   9.612131e-32
## comp 50 2.116843e-32
                                   4.503921e-32
           cumulative percentage of variance
## comp 1
                                     20.74658
## comp 2
                                     38.71455
## comp 3
                                     48.53867
## comp 4
                                     54.86201
## comp 5
                                     59.99665
## comp 6
                                     64.09564
## comp 7
                                     68.00320
## comp 8
                                     71.45245
## comp 9
                                     74.40477
## comp 10
                                     77.13340
                                     79.55427
## comp 11
## comp 12
                                     81.70642
## comp 13
                                     83.82465
## comp 14
                                     85.75958
## comp 15
                                     87.65236
                                     89.30589
## comp 16
## comp 17
                                     90.82574
## comp 18
                                     92.12744
## comp 19
                                     93.32868
```

```
## comp 20
                                      94.37643
                                      95.30694
## comp 21
## comp 22
                                      96.17311
## comp 23
                                      96.92184
## comp 24
                                      97.60463
## comp 25
                                      98.19871
## comp 26
                                      98.67240
## comp 27
                                      99.11138
## comp 28
                                      99.43800
## comp 29
                                      99.66467
## comp 30
                                      99.82959
                                      99.88689
## comp 31
## comp 32
                                      99.93248
## comp 33
                                      99.94939
                                      99.96186
## comp 34
## comp 35
                                      99.97114
## comp 36
                                      99.97940
## comp 37
                                      99.98547
## comp 38
                                      99.99130
## comp 39
                                      99.99553
## comp 40
                                      99.99798
## comp 41
                                      99.99971
                                     100.00000
## comp 42
## comp 43
                                     100.00000
                                     100.00000
## comp 44
## comp 45
                                     100.00000
## comp 46
                                     100.00000
## comp 47
                                     100.00000
## comp 48
                                     100.00000
## comp 49
                                     100.00000
## comp 50
                                     100.00000
```

pca\$var\$contrib

```
##
                                                          Dim.1
                                                                        Dim.2
## small_likes_large_post_count_timeline
                                                   1.433729e+00 2.259126e+00
## large_is_tagged_in_small_status_count_action
                                                   8.181495e-02 4.314722e-02
## small_comments_on_large_post_count_timeline
                                                   1.193601e+00 9.384151e-01
## small_is_tagged_in_large_post_count_timeline
                                                   2.284305e-02 8.085714e-02
## small_is_tagged_in_large_post_count_action
                                                   2.284305e-02 8.085714e-02
## large_is_tagged_in_small_post_count_timeline
                                                   0.000000e+00 7.703720e-32
## small_comments_on_large_status_count_timeline
                                                   2.938837e+00 5.349675e+00
## co_like_post_count
                                                   9.415136e-03 1.612354e-03
## large_posts_photo_video_to_small_timeline_count 1.578846e+00 1.405891e+00
## large_comments_on_small_post_count_timeline
                                                   2.306936e+00 1.420558e+00
## small_is_tagged_in_large_status_count_timeline
                                                   6.677494e-01 3.907031e-01
## large_comments_on_small_post_count_action
                                                   2.306936e+00 1.420558e+00
## large_is_tagged_in_small_post_count_action
                                                   4.276424e-48 6.842278e-47
                                                   3.252518e+00 1.011430e+00
## co_comment_status_count
## large_is_tagged_in_small_status_count_timeline 3.969346e-01 1.354987e-01
## co_like_photo_count
                                                   1.465785e+00 1.623619e-01
## large_likes_small_post_count_action
                                                   2.237209e+00 1.861894e+00
                                                   3.315883e+00 5.308597e+00
## small_comments_on_large_photo_count_action
                                                   9.495568e-64 2.430865e-61
## co_tagged_post_count
```

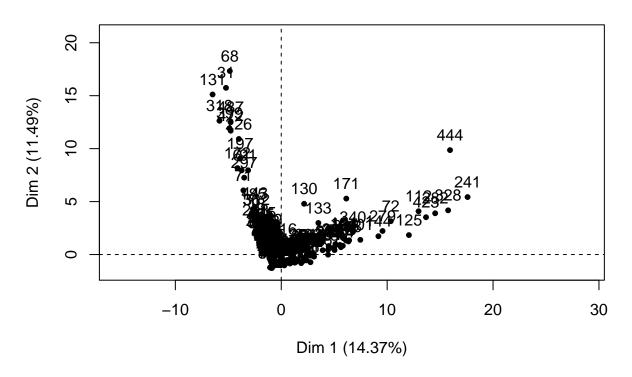
```
## large likes small status count action
                                                    5.113580e+00 4.431805e+00
## small_posts_post_to_large_timeline_count
                                                    8.339369e-02 1.816898e-01
                                                    2.569994e+00 5.255232e+00
## small likes large photo count action
                                                    3.568371e+00 3.256699e+00
## large_comments_on_small_status_count_timeline
## co attended event count
                                                    5.026358e-03 2.380440e-02
## small_comments_on_large_photo_count_timeline
                                                    3.297697e+00 5.775624e+00
## small posts photo video to large timeline count 7.362744e-01 6.042773e-01
                                                    3.733383e-01 1.257688e-02
## large posts post to small timeline count
## small is tagged in large status count action
                                                    1.544091e-01 4.288840e-01
## large_is_tagged_in_small_photo_count_action
                                                    2.335765e+00 4.224938e-03
## co_tagged_status_count
                                                    8.960030e-01 1.273041e-02
## large_likes_small_post_count_timeline
                                                    2.237209e+00 1.861894e+00
## small_likes_large_post_count_action
                                                    1.807635e+00 1.833399e+00
## large_likes_small_status_count_timeline
                                                    4.807534e+00 4.694361e+00
## small_likes_large_photo_count_timeline
                                                    2.567490e+00 5.488114e+00
## large_likes_small_photo_count_action
                                                    4.773923e+00 4.217180e+00
## co_comment_photo_count
                                                    3.520250e+00 5.438991e-01
## small comments on large post count action
                                                    1.193601e+00 9.384151e-01
## small_likes_large_status_count_timeline
                                                    2.599680e+00 5.409827e+00
## large comments on small photo count action
                                                    5.206413e+00 3.711454e+00
## large_comments_on_small_status_count_action
                                                    5.109989e+00 1.524881e+00
## co like status count
                                                    5.686789e-02 5.959603e-05
## large_comments_on_small_photo_count_timeline
                                                    4.817404e+00 4.244298e+00
## small is tagged in large photo count action
                                                    2.195158e+00 3.766149e+00
                                                    4.510516e+00 4.569269e+00
## large_likes_small_photo_count_timeline
## co comment post count
                                                    3.731368e-02 8.520116e-02
## large_is_tagged_in_small_photo_count_timeline
                                                    4.113318e+00 3.766679e+00
## co_tagged_photo_count
                                                    1.372959e+00 1.972311e-01
                                                    2.889052e+00 3.660680e+00
## small_comments_on_large_status_count_action
## small_likes_large_status_count_action
                                                    2.511388e+00 5.259800e+00
                                                    1.306568e+00 2.368479e+00
## small_is_tagged_in_large_photo_count_timeline
##
                                                           Dim.3
                                                                        Dim.4
## small_likes_large_post_count_timeline
                                                    3.188308e+00 1.952575e+00
## large_is_tagged_in_small_status_count_action
                                                    2.389268e-01 3.289604e-01
## small comments on large post count timeline
                                                    1.007907e+01 1.834685e+00
## small_is_tagged_in_large_post_count_timeline
                                                    7.030557e-01 6.776536e-01
## small is tagged in large post count action
                                                    7.030557e-01 6.776536e-01
## large_is_tagged_in_small_post_count_timeline
                                                    3.081488e-31 3.728600e-29
## small_comments_on_large_status_count_timeline
                                                    4.033699e-01 6.162855e-01
## co_like_post_count
                                                    2.233299e-04 6.909578e-05
## large posts photo video to small timeline count 2.410145e-01 1.867544e+00
## large comments on small post count timeline
                                                    2.665083e+00 9.082816e+00
## small is tagged in large status count timeline
                                                    8.068975e+00 1.820612e-01
                                                    2.665083e+00 9.082816e+00
## large_comments_on_small_post_count_action
## large_is_tagged_in_small_post_count_action
                                                    0.000000e+00 4.701977e-36
                                                    1.847098e+00 1.747306e-02
## co_comment_status_count
## large_is_tagged_in_small_status_count_timeline
                                                   3.812572e+00 1.186720e+01
## co_like_photo_count
                                                    8.692385e-01 2.264023e-01
## large_likes_small_post_count_action
                                                    1.858421e+00 9.310630e+00
## small_comments_on_large_photo_count_action
                                                    1.227842e+00 7.020838e-01
## co_tagged_post_count
                                                    0.000000e+00 0.000000e+00
                                                    4.086798e-01 9.091595e-01
## large_likes_small_status_count_action
## small_posts_post_to_large_timeline_count
                                                    1.048160e+00 4.514841e+00
## small likes large photo count action
                                                    1.593011e+00 5.277370e-01
```

```
## large comments on small status count timeline
                                                    3.887169e-01 1.732063e-01
                                                    7.423072e-02 5.805475e-04
## co_attended_event_count
                                                    1.028680e+00 4.527552e-01
## small comments on large photo count timeline
## small_posts_photo_video_to_large_timeline_count 8.012793e+00 6.921005e+00
## large posts post to small timeline count
                                                    6.698174e-01 5.725819e+00
## small is tagged in large status count action
                                                    1.089498e+00 1.431336e-03
## large is tagged in small photo count action
                                                    5.830109e+00 7.948214e+00
                                                    1.479355e+01 6.130126e-01
## co tagged status count
## large_likes_small_post_count_timeline
                                                    1.858421e+00 9.310630e+00
## small_likes_large_post_count_action
                                                    2.061155e+00 1.742896e+00
## large_likes_small_status_count_timeline
                                                    6.526111e-01 6.931169e-01
## small_likes_large_photo_count_timeline
                                                    1.553701e+00 4.192503e-01
## large_likes_small_photo_count_action
                                                    7.869794e-01 1.079991e+00
                                                    1.347755e+00 1.503943e-02
## co_comment_photo_count
## small_comments_on_large_post_count_action
                                                    1.007907e+01 1.834685e+00
## small_likes_large_status_count_timeline
                                                    3.189878e-01 3.415786e-01
## large_comments_on_small_photo_count_action
                                                    8.825481e-01 1.121030e+00
## large comments on small status count action
                                                    6.230995e-01 8.591601e-02
                                                    1.064992e+00 1.798220e+00
## co_like_status_count
## large comments on small photo count timeline
                                                    7.808729e-01 1.206229e+00
## small_is_tagged_in_large_photo_count_action
                                                    1.351287e+00 1.679038e-01
## large_likes_small_photo_count_timeline
                                                    7.236462e-01 1.039194e+00
## co_comment_post_count
                                                    5.348229e-01 8.447229e-01
## large is tagged in small photo count timeline
                                                    5.279049e-01 9.330727e-01
                                                    2.680652e-01 2.627396e-01
## co_tagged_photo_count
## small_comments_on_large_status_count_action
                                                    1.645644e-01 5.842069e-01
## small_likes_large_status_count_action
                                                    4.558029e-01 3.048799e-01
                                                    4.551279e-01 3.102720e-05
## small_is_tagged_in_large_photo_count_timeline
##
                                                           Dim.5
## small_likes_large_post_count_timeline
                                                    1.332666e-03
## large_is_tagged_in_small_status_count_action
                                                    9.880451e-01
## small_comments_on_large_post_count_timeline
                                                    1.087963e+00
## small_is_tagged_in_large_post_count_timeline
                                                    2.345245e+01
## small_is_tagged_in_large_post_count_action
                                                    2.345245e+01
## large is tagged in small post count timeline
                                                    5.085659e-32
## small_comments_on_large_status_count_timeline
                                                    6.058991e-01
## co like post count
                                                    1.174759e-02
## large_posts_photo_video_to_small_timeline_count 1.890457e-03
## large_comments_on_small_post_count_timeline
                                                    1.602579e-02
## small_is_tagged_in_large_status_count_timeline
                                                    5.914822e+00
## large comments on small post count action
                                                    1.602579e-02
## large_is_tagged_in_small_post_count_action
                                                    1.232595e-30
## co comment status count
                                                    1.939567e-01
## large_is_tagged_in_small_status_count_timeline
                                                    1.905412e-02
## co_like_photo_count
                                                    4.183801e-01
## large_likes_small_post_count_action
                                                    2.787964e-03
## small_comments_on_large_photo_count_action
                                                    4.366524e-02
## co_tagged_post_count
                                                    0.000000e+00
## large_likes_small_status_count_action
                                                    3.961355e-02
## small_posts_post_to_large_timeline_count
                                                    1.314132e+00
## small_likes_large_photo_count_action
                                                    3.315889e-01
## large_comments_on_small_status_count_timeline
                                                    6.545966e-02
## co attended event count
                                                    1.565020e+00
## small comments on large photo count timeline
                                                    1.198217e-01
```

```
## small_posts_photo_video_to_large_timeline_count 5.663482e+00
## large_posts_post_to_small_timeline_count
                                                    1.379319e+00
## small_is_tagged_in_large_status_count_action
                                                    1.508074e+01
## large_is_tagged_in_small_photo_count_action
                                                    4.482399e+00
## co_tagged_status_count
                                                    3.476268e+00
                                                    2.787964e-03
## large_likes_small_post_count_timeline
                                                    9.742229e-02
## small_likes_large_post_count_action
## large_likes_small_status_count_timeline
                                                    9.586769e-02
## small_likes_large_photo_count_timeline
                                                    4.311598e-01
## large_likes_small_photo_count_action
                                                    5.330728e-02
## co_comment_photo_count
                                                    2.585211e-01
## small_comments_on_large_post_count_action
                                                    1.087963e+00
## small_likes_large_status_count_timeline
                                                    1.675304e-01
## large_comments_on_small_photo_count_action
                                                    5.763072e-02
## large_comments_on_small_status_count_action
                                                    3.705995e-05
## co_like_status_count
                                                    2.123602e+00
## large_comments_on_small_photo_count_timeline
                                                    9.448312e-02
## small_is_tagged_in_large_photo_count_action
                                                    1.958081e-01
## large_likes_small_photo_count_timeline
                                                    5.468303e-02
## co_comment_post_count
                                                    2.476817e+00
## large_is_tagged_in_small_photo_count_timeline
                                                    4.167281e-02
## co_tagged_photo_count
                                                    7.051066e-01
## small_comments_on_large_status_count_action
                                                    1.228114e+00
## small_likes_large_status_count_action
                                                    1.805073e-01
## small_is_tagged_in_large_photo_count_timeline
                                                    9.026313e-01
new_x = x[c(-270, -274, -374, -158, -277, -375, -173, -50, -355)] # remove outliers
```

Individuals factor map (PCA)

 $pca2 = PCA(new_x)$



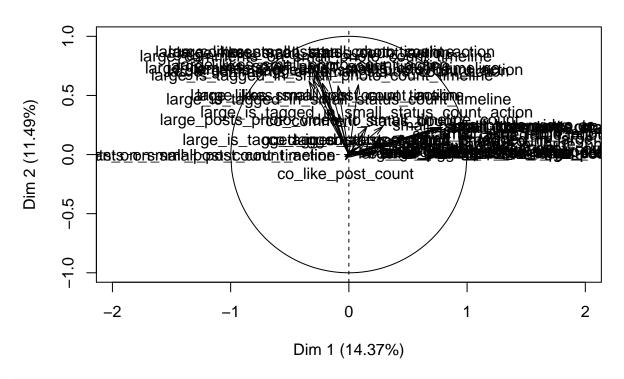
```
## Warning in arrows(0, 0, coord.var[v, 1], coord.var[v, 2], length = 0.1, :
## zero-length arrow is of indeterminate angle and so skipped

## Warning in arrows(0, 0, coord.var[v, 1], coord.var[v, 2], length = 0.1, :
## zero-length arrow is of indeterminate angle and so skipped

## Warning in arrows(0, 0, coord.var[v, 1], coord.var[v, 2], length = 0.1, :
## zero-length arrow is of indeterminate angle and so skipped

## Warning in arrows(0, 0, coord.var[v, 1], coord.var[v, 2], length = 0.1, :
## zero-length arrow is of indeterminate angle and so skipped
```

Variables factor map (PCA)



pca2\$eig

```
eigenvalue percentage of variance
##
           6.611119e+00
                                   1.437200e+01
## comp 1
           5.285957e+00
                                   1.149121e+01
           3.164357e+00
                                   6.879037e+00
##
  comp 3
           2.345768e+00
                                   5.099496e+00
           2.228655e+00
                                   4.844903e+00
   comp 5
           2.162807e+00
                                   4.701755e+00
   comp 7
           2.012647e+00
                                   4.375320e+00
                                   4.075301e+00
   comp 8
           1.874638e+00
           1.733545e+00
                                   3.768577e+00
## comp 9
## comp 10 1.698002e+00
                                   3.691309e+00
## comp 11 1.558893e+00
                                   3.388898e+00
## comp 12 1.445968e+00
                                   3.143408e+00
```

```
## comp 13 1.307590e+00
                                  2.842587e+00
## comp 14 1.233157e+00
                                  2.680775e+00
## comp 15 1.122679e+00
                                  2.440607e+00
## comp 16 1.080609e+00
                                  2.349150e+00
## comp 17 9.967430e-01
                                  2.166833e+00
## comp 18 9.441761e-01
                                  2.052557e+00
## comp 19 8.977656e-01
                                  1.951664e+00
## comp 20 8.508869e-01
                                  1.849754e+00
## comp 21 7.861316e-01
                                  1.708982e+00
## comp 22 7.228873e-01
                                  1.571494e+00
## comp 23 6.591404e-01
                                  1.432914e+00
## comp 24 6.343108e-01
                                  1.378936e+00
## comp 25 5.793637e-01
                                  1.259486e+00
                                  1.180137e+00
## comp 26 5.428632e-01
## comp 27 4.759589e-01
                                  1.034693e+00
## comp 28 4.496525e-01
                                  9.775053e-01
## comp 29 2.910995e-01
                                  6.328250e-01
## comp 30 9.384572e-02
                                  2.040124e-01
## comp 31 7.521899e-02
                                  1.635196e-01
## comp 32 4.424438e-02
                                  9.618344e-02
## comp 33 2.486197e-02
                                  5.404777e-02
## comp 34 2.348796e-02
                                  5.106078e-02
## comp 35 1.412500e-02
                                  3.070652e-02
## comp 36 1.208213e-02
                                  2.626550e-02
## comp 37 6.676887e-03
                                  1.451497e-02
## comp 38 5.136735e-03
                                  1.116682e-02
## comp 39 2.731461e-03
                                  5.937959e-03
## comp 40 2.171719e-04
                                  4.721128e-04
## comp 41 2.140316e-28
                                  4.652861e-28
## comp 42 1.729557e-28
                                  3.759907e-28
## comp 43 4.792493e-29
                                  1.041846e-28
## comp 44 3.291046e-29
                                  7.154448e-29
## comp 45 2.198393e-29
                                  4.779115e-29
## comp 46 3.427713e-30
                                  7.451549e-30
## comp 47 3.556052e-32
                                  7.730547e-32
## comp 48 3.556052e-32
                                  7.730547e-32
## comp 49 3.556052e-32
                                  7.730547e-32
## comp 50 1.016611e-32
                                  2.210023e-32
           cumulative percentage of variance
## comp 1
                                    14.37200
## comp 2
                                     25.86321
## comp 3
                                    32.74225
## comp 4
                                    37.84174
## comp 5
                                    42.68664
## comp 6
                                    47.38840
## comp 7
                                    51.76372
## comp 8
                                    55.83902
## comp 9
                                    59.60760
## comp 10
                                    63.29891
## comp 11
                                    66.68780
## comp 12
                                    69.83121
## comp 13
                                    72.67380
## comp 14
                                    75.35457
## comp 15
                                    77.79518
```

```
## comp 16
                                      80.14433
                                      82.31116
## comp 17
## comp 18
                                      84.36372
## comp 19
                                      86.31538
## comp 20
                                      88.16514
## comp 21
                                      89.87412
                                      91.44561
## comp 22
## comp 23
                                      92.87853
## comp 24
                                      94.25747
## comp 25
                                      95.51695
## comp 26
                                      96.69709
## comp 27
                                      97.73178
## comp 28
                                      98.70929
## comp 29
                                      99.34211
                                      99.54612
## comp 30
## comp 31
                                      99.70964
## comp 32
                                      99.80583
## comp 33
                                      99.85988
## comp 34
                                      99.91094
## comp 35
                                      99.94164
## comp 36
                                      99.96791
                                      99.98242
## comp 37
                                      99.99359
## comp 38
                                      99.99953
## comp 39
## comp 40
                                     100.00000
## comp 41
                                     100.00000
## comp 42
                                     100.00000
## comp 43
                                     100.00000
## comp 44
                                     100.00000
## comp 45
                                     100.00000
## comp 46
                                     100.00000
## comp 47
                                     100.00000
## comp 48
                                     100.00000
                                     100.00000
## comp 49
## comp 50
                                     100.00000
```

pca2\$var\$contrib

```
Dim.1
                                                                       Dim.2
                                                   2.302413e+00 2.896338e-02
## small_likes_large_post_count_timeline
## large_is_tagged_in_small_status_count_action
                                                   3.475049e-01 1.028073e+00
## small_comments_on_large_post_count_timeline
                                                   4.970683e-01 5.648360e-06
## small_is_tagged_in_large_post_count_timeline
                                                   5.268781e-01 2.508674e-03
## small_is_tagged_in_large_post_count_action
                                                   5.268781e-01 2.508674e-03
## large_is_tagged_in_small_post_count_timeline
                                                   4.814825e-33 1.232595e-30
                                                   8.216641e+00 9.395553e-01
## small_comments_on_large_status_count_timeline
## co_like_post_count
                                                   1.171532e-02 3.570503e-02
## large_posts_photo_video_to_small_timeline_count 9.297856e-02 5.371989e-01
## large_comments_on_small_post_count_timeline
                                                   1.527661e-02 4.759719e-03
## small_is_tagged_in_large_status_count_timeline 3.046005e+00 2.686685e-01
## large_comments_on_small_post_count_action
                                                   1.527661e-02 4.759719e-03
## large_is_tagged_in_small_post_count_action
                                                   2.736911e-46 0.000000e+00
## co_comment_status_count
                                                   1.642972e-01 4.797945e-01
## large_is_tagged_in_small_status_count_timeline 1.100733e-01 2.194056e+00
```

```
## co like photo count
                                                    1.087030e-01 2.751618e-05
## large_likes_small_post_count_action
                                                    5.069163e-01 2.672282e+00
## small comments on large photo count action
                                                    8.904126e+00 1.000687e+00
## co_tagged_post_count
                                                    0.000000e+00 0.000000e+00
## large likes small status count action
                                                    1.347352e+00 1.028970e+01
## small posts post to large timeline count
                                                    6.112757e-01 6.799281e-04
## small likes large photo count action
                                                    7.082869e+00 6.033444e-01
                                                    7.556235e-01 6.872679e+00
## large_comments_on_small_status_count_timeline
## co attended event count
                                                    1.658722e-01 1.073917e-02
## small_comments_on_large_photo_count_timeline
                                                    9.469152e+00 9.952957e-01
## small_posts_photo_video_to_large_timeline_count 1.257114e+00 1.070702e+00
## large_posts_post_to_small_timeline_count
                                                    5.726411e-01 1.180906e-04
## small_is_tagged_in_large_status_count_action
                                                    3.046005e+00 2.686685e-01
## large_is_tagged_in_small_photo_count_action
                                                    9.809573e-02 6.595805e+00
## co_tagged_status_count
                                                    0.000000e+00 0.000000e+00
## large_likes_small_post_count_timeline
                                                    5.069163e-01 2.672282e+00
## small_likes_large_post_count_action
                                                    2.302413e+00 2.896338e-02
## large likes small status count timeline
                                                    1.517288e+00 1.050192e+01
## small_likes_large_photo_count_timeline
                                                    7.098867e+00 4.808638e-01
## large_likes_small_photo_count_action
                                                    1.402212e+00 7.655605e+00
## co_comment_photo_count
                                                    8.209716e-01 3.616996e-03
## small_comments_on_large_post_count_action
                                                    4.970683e-01 5.648360e-06
## small_likes_large_status_count_timeline
                                                    9.043003e+00 8.864091e-01
## large comments on small photo count action
                                                    6.043592e-01 1.047441e+01
## large comments on small status count action
                                                    1.265331e-01 6.376295e+00
## co like status count
                                                    5.414906e-02 6.010265e-02
## large_comments_on_small_photo_count_timeline
                                                    1.181729e+00 9.392479e+00
## small_is_tagged_in_large_photo_count_action
                                                    3.172813e+00 4.872444e-01
## large_likes_small_photo_count_timeline
                                                    1.723953e+00 7.284527e+00
## co_comment_post_count
                                                    5.299400e-01 3.945729e-02
## large_is_tagged_in_small_photo_count_timeline
                                                    7.697096e-01 5.596480e+00
## co_tagged_photo_count
                                                    3.196608e-01 2.047515e-01
## small_comments_on_large_status_count_action
                                                    8.101330e+00 9.388936e-01
## small_likes_large_status_count_action
                                                    9.047487e+00 8.986464e-01
## small_is_tagged_in_large_photo_count_timeline
                                                    1.380845e+00 1.097693e-01
                                                           Dim.3
                                                                        Dim.4
## small likes large post count timeline
                                                    4.219527e+00 1.235203e+01
## large_is_tagged_in_small_status_count_action
                                                    1.360109e+00 3.823211e-04
## small_comments_on_large_post_count_timeline
                                                    1.236983e+01 2.263240e-01
## small_is_tagged_in_large_post_count_timeline
                                                    1.027575e+01 1.174945e+00
## small is tagged in large post count action
                                                    1.027575e+01 1.174945e+00
## large is tagged in small post count timeline
                                                    6.933348e-31 3.081488e-31
## small_comments_on_large_status_count_timeline
                                                    6.381024e-02 2.285292e+00
## co_like_post_count
                                                    8.999158e-04 2.758473e-02
## large_posts_photo_video_to_small_timeline_count 1.057943e-04 3.227738e-04
## large_comments_on_small_post_count_timeline
                                                    5.603657e-03 4.096089e-01
## small_is_tagged_in_large_status_count_timeline
                                                   9.193967e+00 5.005442e+00
## large_comments_on_small_post_count_action
                                                    5.603657e-03 4.096089e-01
## large_is_tagged_in_small_post_count_action
                                                    1.836710e-36 1.925930e-32
## co_comment_status_count
                                                    1.444709e-01 9.928997e-03
## large_is_tagged_in_small_status_count_timeline
                                                   2.020260e-01 1.573372e-01
## co_like_photo_count
                                                    7.409744e-01 6.964078e-01
## large_likes_small_post_count_action
                                                    1.989815e-01 3.264657e-01
## small comments on large photo count action
                                                    8.305337e-01 1.878112e+00
```

```
## co tagged post count
                                                    7.006492e-44 0.000000e+00
## large_likes_small_status_count_action
                                                    1.618679e-01 3.140926e-03
                                                    2.608712e-01 5.825578e+00
## small posts post to large timeline count
## small_likes_large_photo_count_action
                                                    4.753114e+00 1.757635e-01
## large_comments_on_small_status_count_timeline
                                                    1.266618e-01 1.754853e-01
## co attended event count
                                                    6.006460e-01 6.875361e-01
## small comments on large photo count timeline
                                                    7.499639e-01 1.331922e+00
## small posts photo video to large timeline count 1.657665e+00 1.444853e+00
## large posts post to small timeline count
                                                    2.561183e-01 5.738124e+00
## small_is_tagged_in_large_status_count_action
                                                    9.193967e+00 5.005442e+00
## large_is_tagged_in_small_photo_count_action
                                                    8.588752e-01 1.311882e+00
## co_tagged_status_count
                                                    0.000000e+00 0.000000e+00
## large_likes_small_post_count_timeline
                                                    1.989815e-01 3.264657e-01
                                                    4.219527e+00 1.235203e+01
## small_likes_large_post_count_action
## large_likes_small_status_count_timeline
                                                    1.349693e-01 2.622661e-02
## small_likes_large_photo_count_timeline
                                                    4.915134e+00 3.709662e-01
## large_likes_small_photo_count_action
                                                    2.654582e-03 6.830769e-02
## co comment photo count
                                                    3.992077e-01 5.929203e-01
## small_comments_on_large_post_count_action
                                                    1.236983e+01 2.263240e-01
## small likes large status count timeline
                                                    1.022110e+00 7.752415e-01
## large_comments_on_small_photo_count_action
                                                    5.315330e-02 3.566272e-01
## large_comments_on_small_status_count_action
                                                    7.184377e-03 3.697291e-01
                                                    1.258113e+00 4.949734e-02
## co_like_status_count
## large comments on small photo count timeline
                                                    2.009017e-02 6.970166e-02
## small_is_tagged_in_large_photo_count_action
                                                    2.093210e+00 5.837449e-01
## large likes small photo count timeline
                                                    8.869123e-03 2.466756e-02
## co_comment_post_count
                                                    3.030059e+00 9.360167e-02
## large_is_tagged_in_small_photo_count_timeline
                                                    8.622068e-04 2.945263e-01
## co_tagged_photo_count
                                                    1.030219e-01 1.630405e+01
## small_comments_on_large_status_count_action
                                                    1.231817e-02 2.534515e+00
## small_likes_large_status_count_action
                                                    1.152477e+00 8.304108e-01
## small_is_tagged_in_large_photo_count_timeline
                                                    4.905203e-01 1.591597e+01
##
                                                           Dim.5
## small_likes_large_post_count_timeline
                                                    1.974066e+00
## large is tagged in small status count action
                                                    1.142607e+01
## small_comments_on_large_post_count_timeline
                                                    7.435134e-01
## small is tagged in large post count timeline
                                                    5.866896e-01
## small_is_tagged_in_large_post_count_action
                                                    5.866896e-01
## large_is_tagged_in_small_post_count_timeline
                                                    9.750020e-32
## small_comments_on_large_status_count_timeline
                                                    2.207060e-03
## co like post count
                                                    5.706797e-05
## large posts photo video to small timeline count 1.825863e-01
## large_comments_on_small_post_count_timeline
                                                    5.776918e+00
## small_is_tagged_in_large_status_count_timeline
                                                   2.839426e-01
## large_comments_on_small_post_count_action
                                                    5.776918e+00
## large_is_tagged_in_small_post_count_action
                                                    2.773339e-30
## co_comment_status_count
                                                    2.285539e-04
## large_is_tagged_in_small_status_count_timeline
                                                   1.408785e+01
## co_like_photo_count
                                                    1.164131e-01
## large_likes_small_post_count_action
                                                    6.534834e+00
## small_comments_on_large_photo_count_action
                                                    5.387441e-03
## co_tagged_post_count
                                                    0.00000e+00
## large_likes_small_status_count_action
                                                    2.779763e-01
## small posts post to large timeline count
                                                    1.092661e+00
```

```
## small_likes_large_photo_count_action
                                                    6.830152e-03
## large_comments_on_small_status_count_timeline
                                                   7.637534e+00
## co attended event count
                                                    2.602741e-01
## small_comments_on_large_photo_count_timeline
                                                   5.674429e-03
## small_posts_photo_video_to_large_timeline_count 3.913307e-01
## large posts post to small timeline count
                                                    1.110344e+00
## small is tagged in large status count action
                                                   2.839426e-01
## large_is_tagged_in_small_photo_count_action
                                                   2.133658e-01
## co tagged status count
                                                    3.941152e-44
## large_likes_small_post_count_timeline
                                                    6.534834e+00
## small_likes_large_post_count_action
                                                    1.974066e+00
## large_likes_small_status_count_timeline
                                                    2.763238e-01
## small_likes_large_photo_count_timeline
                                                    2.155448e-03
                                                   8.056957e+00
## large_likes_small_photo_count_action
## co_comment_photo_count
                                                    1.319127e-01
## small_comments_on_large_post_count_action
                                                    7.435134e-01
## small_likes_large_status_count_timeline
                                                    1.338798e-01
## large comments on small photo count action
                                                    2.021869e+00
## large_comments_on_small_status_count_action
                                                   8.169788e+00
## co like status count
                                                    1.719481e-02
                                                   1.727860e+00
## large_comments_on_small_photo_count_timeline
## small_is_tagged_in_large_photo_count_action
                                                   8.519769e-02
## large_likes_small_photo_count_timeline
                                                   7.852232e+00
## co comment post count
                                                    9.199636e-01
## large_is_tagged_in_small_photo_count_timeline
                                                   2.390387e-01
## co_tagged_photo_count
                                                   7.390366e-01
## small_comments_on_large_status_count_action
                                                    5.600773e-02
## small_likes_large_status_count_action
                                                    1.199328e-01
## small_is_tagged_in_large_photo_count_timeline
                                                   8.339328e-01
# inTrain <- createDataPartition(new_data, p = 0.7, list=FALSE)</pre>
# train <- total[inTrain,] #get training data</pre>
# test <- total[-inTrain,]</pre>
# traincontrol <- trainControl(method = "cv", number = 10, verboseIter=TRUE)
sample = sample.split(friended, SplitRatio = .7)
train = subset(new_data, sample == TRUE)
test = subset(new_data, sample == FALSE)
# train_x = train[,0:50]
\# train_y = train[,51]
\# test_x = test[,0:50]
\# test_y = test[,51]
model_logit = glm(friended~., data = train, family = binomial())
## Warning: glm.fit: fitted probabilities numerically 0 or 1 occurred
# knitr::opts_chunk$set(warning=FALSE, message=FALSE)
logistic2 = stepAIC(model_logit,direction = "backward")
# summary(logistic)
```

```
## Stepwise Model Path
## Analysis of Deviance Table
##
## Initial Model:
##
  friended ~ small_likes_large_post_count_timeline + large_is_tagged_in_small_status_count_action +
##
       small comments on large post count timeline + small is tagged in large post count timeline +
##
       small is tagged in large post count action + large is tagged in small post count timeline +
       small comments on large status count timeline + co like post count +
##
##
       large_posts_photo_video_to_small_timeline_count + large_comments_on_small_post_count_timeline +
##
       small_is_tagged_in_large_status_count_timeline + large_comments_on_small_post_count_action +
##
       large_is_tagged_in_small_post_count_action + co_comment_status_count +
##
       large_is_tagged_in_small_status_count_timeline + co_like_photo_count +
       large_likes_small_post_count_action + small_comments_on_large_photo_count_action +
##
       co_tagged_post_count + large_likes_small_status_count_action +
##
##
       small_posts_post_to_large_timeline_count + small_likes_large_photo_count_action +
##
       large_comments_on_small_status_count_timeline + co_attended_event_count +
##
       small_comments_on_large_photo_count_timeline + small_posts_photo_video_to_large_timeline_count +
       large posts post to small timeline count + small is tagged in large status count action +
##
##
       large_is_tagged_in_small_photo_count_action + co_tagged_status_count +
##
       large likes small post count timeline + small likes large post count action +
##
       large_likes_small_status_count_timeline + small_likes_large_photo_count_timeline +
##
       large likes small photo count action + co comment photo count +
##
       small_comments_on_large_post_count_action + small_likes_large_status_count_timeline +
##
       large comments on small photo count action + large comments on small status count action +
##
       co like status count + large comments on small photo count timeline +
##
       small_is_tagged_in_large_photo_count_action + large_likes_small_photo_count_timeline +
##
       co_comment_post_count + large_is_tagged_in_small_photo_count_timeline +
##
       co_tagged_photo_count + small_comments_on_large_status_count_action +
##
       small_likes_large_status_count_action + small_is_tagged_in_large_photo_count_timeline
##
## Final Model:
  friended ~ small_likes_large_post_count_timeline + small_comments_on_large_post_count_timeline +
##
       small_comments_on_large_status_count_timeline + co_comment_status_count +
##
       co_like_photo_count + large_likes_small_post_count_action +
##
       large_likes_small_status_count_action + small_likes_large_photo_count_action +
##
       large_comments_on_small_status_count_timeline + co_attended_event_count +
##
       small posts photo video to large timeline count + large posts post to small timeline count +
##
       large_likes_small_status_count_timeline + large_likes_small_photo_count_action +
##
       large comments on small photo count action + large comments on small status count action +
##
       small_is_tagged_in_large_photo_count_action + large_likes_small_photo_count_timeline +
##
       co tagged photo count + small likes large status count action +
##
       small_is_tagged_in_large_photo_count_timeline
##
##
##
                                                   Step Df
                                                                Deviance
## 1
            - small_comments_on_large_post_count_action 0 0.000000e+00
## 2
## 3
                - large_likes_small_post_count_timeline
                                                         0 0.000000e+00
## 4
                               co_tagged_status_count
                                                         0 0.000000e+00
## 5
                                 - co_tagged_post_count
                                                         0 0.000000e+00
## 6
           - large_is_tagged_in_small_post_count_action 0 0.000000e+00
## 7
            - large_comments_on_small_post_count_action 0 0.000000e+00
## 8
         - large_is_tagged_in_small_post_count_timeline
                                                         0 0.000000e+00
## 9
           - small is tagged in large post count action 0 0.000000e+00
```

```
## 10
          - large_is_tagged_in_small_photo_count_action
                                                          1 1.428756e-08
## 11
                                                           1 3.039958e-09
         - small_is_tagged_in_large_post_count_timeline
## 12
                                 - co comment post count
                                                           1 4.847863e-09
## 13
       - large_is_tagged_in_small_status_count_timeline
                                                           1 1.623783e-08
##
  14
      - large_posts_photo_video_to_small_timeline_count
                                                           1 8.239300e-08
## 15
              - small posts post to large timeline count
                                                           1 3.627628e-07
## 16
         - small is tagged in large status count action
                                                           1 5.589953e-09
          - large_comments_on_small_post_count_timeline
                                                           1 2.672093e-08
## 17
## 18
                   - small_likes_large_post_count_action
                                                           1 1.499441e-08
## 19
       - small_is_tagged_in_large_status_count_timeline
                                                           1 2.315522e-04
## 20
         - small_comments_on_large_photo_count_timeline
                                                           1 4.108793e-04
## 21
         - large_is_tagged_in_small_status_count_action
                                                           1 3.420938e-03
## 22
                                  - co_like_status_count
                                                           1 2.018452e-02
## 23
                                - co_comment_photo_count
                                                           1 7.930932e-02
## 24
                                     - co_like_post_count
                                                           1 2.923141e-01
## 25
          - small_comments_on_large_status_count_action
                                                           1 4.380026e-01
## 26
              - small_likes_large_status_count_timeline
                                                           1 1.086342e+00
## 27
         - large comments on small photo count timeline
                                                           1 1.171686e+00
## 28
               - small_likes_large_photo_count_timeline
                                                           1 6.556551e-03
## 29
           - small_comments_on_large_photo_count_action
                                                           1 1.399310e+00
##
   30
        - large_is_tagged_in_small_photo_count_timeline
                                                           1 1.490237e+00
##
      Resid. Df Resid. Dev
## 1
            307
                   189.4723 275.4723
## 2
            307
                   189.4723 275.4723
## 3
            307
                   189.4723 275.4723
            307
                  189.4723 275.4723
## 5
            307
                   189.4723 275.4723
## 6
            307
                  189.4723 275.4723
## 7
            307
                  189.4723 275.4723
## 8
            307
                   189.4723 275.4723
## 9
            307
                   189.4723 275.4723
## 10
            308
                   189.4723 273.4723
## 11
            309
                   189.4723 271.4723
## 12
            310
                   189.4723 269.4723
## 13
            311
                   189.4723 267.4723
## 14
            312
                   189.4723 265.4723
## 15
            313
                   189.4723 263.4723
## 16
            314
                   189.4723 261.4723
## 17
            315
                   189.4723 259.4723
## 18
            316
                   189.4723 257.4723
## 19
            317
                   189.4726 255.4726
## 20
            318
                   189.4730 253.4730
## 21
            319
                   189.4764 251.4764
## 22
            320
                  189.4966 249.4966
## 23
            321
                   189.5759 247.5759
## 24
            322
                   189.8682 245.8682
## 25
            323
                   190.3062 244.3062
## 26
            324
                   191.3925 243.3925
## 27
            325
                   192.5642 242.5642
## 28
            326
                   192.5708 240.5708
## 29
            327
                   193.9701 239.9701
                  195.4603 239.4603
## 30
            328
```

summary(logistic2)

```
##
## Call:
  glm(formula = friended ~ small_likes_large_post_count_timeline +
##
       small_comments_on_large_post_count_timeline + small_comments_on_large_status_count_timeline +
       co_comment_status_count + co_like_photo_count + large_likes_small_post_count_action +
##
##
       large_likes_small_status_count_action + small_likes_large_photo_count_action +
       large_comments_on_small_status_count_timeline + co_attended_event_count +
##
##
       small_posts_photo_video_to_large_timeline_count + large_posts_post_to_small_timeline_count +
       large_likes_small_status_count_timeline + large_likes_small_photo_count_action +
##
##
       large_comments_on_small_photo_count_action + large_comments_on_small_status_count_action +
##
       small_is_tagged_in_large_photo_count_action + large_likes_small_photo_count_timeline +
##
       co_tagged_photo_count + small_likes_large_status_count_action +
##
       small_is_tagged_in_large_photo_count_timeline, family = binomial(),
##
       data = train)
##
##
  Deviance Residuals:
##
       Min
                      Median
                                    30
                                            Max
                 10
   -3.0229
            -0.4511
                      0.0000
                                0.2968
                                         2.1614
##
## Coefficients:
##
                                                      Estimate Std. Error
## (Intercept)
                                                       -1.0951
                                                                   0.3090
                                                        2.5782
                                                                   1.0784
## small_likes_large_post_count_timeline
                                                       16.8070
## small_comments_on_large_post_count_timeline
                                                                1935.6060
                                                        1.0518
## small_comments_on_large_status_count_timeline
                                                                   0.6553
                                                        1.9329
## co comment status count
                                                                   1.1968
## co like photo count
                                                       -1.1391
                                                                   0.4517
## large_likes_small_post_count_action
                                                       20.1042
                                                                4266.1086
                                                                2651.7614
## large_likes_small_status_count_action
                                                       57.9501
## small_likes_large_photo_count_action
                                                        0.9324
                                                                   0.2680
## large comments on small status count timeline
                                                      -80.3822
                                                                9992.5003
## co attended event count
                                                        0.4491
                                                                   0.2685
## small_posts_photo_video_to_large_timeline_count
                                                       -3.8557
                                                                   1.2632
## large_posts_post_to_small_timeline_count
                                                       18.5215
                                                                3790.8503
## large_likes_small_status_count_timeline
                                                      -55.7356
                                                                2651.7561
                                                        5.3855
## large_likes_small_photo_count_action
                                                                   1.6699
## large comments on small photo count action
                                                        1.6428
                                                                   0.9464
## large_comments_on_small_status_count_action
                                                       96.5599
                                                                9855.4617
## small_is_tagged_in_large_photo_count_action
                                                       82.4169 11722.0771
## large_likes_small_photo_count_timeline
                                                       -3.5327
                                                                   1.4815
                                                       61.7220
                                                                6488.7871
## co_tagged_photo_count
                                                        0.9919
## small_likes_large_status_count_action
                                                                   0.4877
## small_is_tagged_in_large_photo_count_timeline
                                                      -61.0841
                                                                6488.7870
##
                                                    z value Pr(>|z|)
## (Intercept)
                                                     -3.544 0.000394 ***
                                                      2.391 0.016814 *
## small_likes_large_post_count_timeline
## small_comments_on_large_post_count_timeline
                                                      0.009 0.993072
## small comments on large status count timeline
                                                      1.605 0.108474
## co comment status count
                                                      1.615 0.106291
## co_like_photo_count
                                                     -2.522 0.011668 *
## large_likes_small_post_count_action
                                                      0.005 0.996240
```

```
## large likes small status count action
                                                     0.022 0.982565
                                                     3.479 0.000503 ***
## small_likes_large_photo_count_action
## large comments on small status count timeline
                                                    -0.008 0.993582
## co_attended_event_count
                                                     1.673 0.094383 .
## small_posts_photo_video_to_large_timeline_count
                                                    -3.052 0.002270 **
## large posts post to small timeline count
                                                     0.005 0.996102
## large likes small status count timeline
                                                    -0.021 0.983231
## large_likes_small_photo_count_action
                                                     3.225 0.001260 **
## large_comments_on_small_photo_count_action
                                                     1.736 0.082584 .
## large_comments_on_small_status_count_action
                                                     0.010 0.992183
## small_is_tagged_in_large_photo_count_action
                                                     0.007 0.994390
## large_likes_small_photo_count_timeline
                                                    -2.385 0.017100 *
## co_tagged_photo_count
                                                     0.010 0.992411
                                                     2.034 0.041963 *
## small_likes_large_status_count_action
## small_is_tagged_in_large_photo_count_timeline
                                                    -0.009 0.992489
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
##
       Null deviance: 470.29 on 349
                                      degrees of freedom
## Residual deviance: 195.46 on 328 degrees of freedom
## AIC: 239.46
## Number of Fisher Scoring iterations: 23
logistic3 = stepAIC(model_logit, direction = "forward")
## Start: AIC=275.47
## friended ~ small_likes_large_post_count_timeline + large_is_tagged_in_small_status_count_action +
##
       small_comments_on_large_post_count_timeline + small_is_tagged_in_large_post_count_timeline +
##
       small_is_tagged_in_large_post_count_action + large_is_tagged_in_small_post_count_timeline +
##
       small_comments_on_large_status_count_timeline + co_like_post_count +
##
       large_posts_photo_video_to_small_timeline_count + large_comments_on_small_post_count_timeline +
##
       small_is_tagged_in_large_status_count_timeline + large_comments_on_small_post_count_action +
       large_is_tagged_in_small_post_count_action + co_comment_status_count +
##
##
       large_is_tagged_in_small_status_count_timeline + co_like_photo_count +
##
       large_likes_small_post_count_action + small_comments_on_large_photo_count_action +
##
       co_tagged_post_count + large_likes_small_status_count_action +
##
       small_posts_post_to_large_timeline_count + small_likes_large_photo_count_action +
##
       large_comments_on_small_status_count_timeline + co_attended_event_count +
##
       small_comments_on_large_photo_count_timeline + small_posts_photo_video_to_large_timeline_count +
##
       large_posts_post_to_small_timeline_count + small_is_tagged_in_large_status_count_action +
##
       large_is_tagged_in_small_photo_count_action + co_tagged_status_count +
##
       large_likes_small_post_count_timeline + small_likes_large_post_count_action +
##
       large_likes_small_status_count_timeline + small_likes_large_photo_count_timeline +
##
       large_likes_small_photo_count_action + co_comment_photo_count +
##
       small_comments_on_large_post_count_action + small_likes_large_status_count_timeline +
##
       large_comments_on_small_photo_count_action + large_comments_on_small_status_count_action +
##
       co_like_status_count + large_comments_on_small_photo_count_timeline +
##
       small_is_tagged_in_large_photo_count_action + large_likes_small_photo_count_timeline +
##
       co_comment_post_count + large_is_tagged_in_small_photo_count_timeline +
##
       co_tagged_photo_count + small_comments_on_large_status_count_action +
       small_likes_large_status_count_action + small_is_tagged_in_large_photo_count_timeline
##
```

logistic3\$anova

```
## Stepwise Model Path
## Analysis of Deviance Table
##
## Initial Model:
## friended ~ small_likes_large_post_count_timeline + large_is_tagged_in_small_status_count_action +
##
       small_comments_on_large_post_count_timeline + small_is_tagged_in_large_post_count_timeline +
       small_is_tagged_in_large_post_count_action + large_is_tagged_in_small_post_count timeline +
##
       small_comments_on_large_status_count_timeline + co_like_post_count +
##
       large_posts_photo_video_to_small_timeline_count + large_comments_on_small_post_count_timeline +
##
##
       small_is_tagged_in_large_status_count_timeline + large_comments_on_small_post_count_action +
##
       large_is_tagged_in_small_post_count_action + co_comment_status_count +
##
       large_is_tagged_in_small_status_count_timeline + co_like_photo_count +
##
       large_likes_small_post_count_action + small_comments_on_large_photo_count_action +
       co tagged post count + large likes small status count action +
##
##
       small_posts_post_to_large_timeline_count + small_likes_large_photo_count_action +
##
       large comments on small status count timeline + co attended event count +
##
       small_comments_on_large_photo_count_timeline + small_posts_photo_video_to_large_timeline_count +
##
       large_posts_post_to_small_timeline_count + small_is_tagged_in_large_status_count_action +
##
       large_is_tagged_in_small_photo_count_action + co_tagged_status_count +
##
       large_likes_small_post_count_timeline + small_likes_large_post_count_action +
##
       large_likes_small_status_count_timeline + small_likes_large_photo_count_timeline +
##
       large_likes_small_photo_count_action + co_comment_photo_count +
##
       small_comments_on_large_post_count_action + small_likes_large_status_count_timeline +
       large_comments_on_small_photo_count_action + large_comments_on_small_status_count_action +
##
##
       co_like_status_count + large_comments_on_small_photo_count_timeline +
##
       small_is_tagged_in_large_photo_count_action + large_likes_small_photo_count_timeline +
##
       co_comment_post_count + large_is_tagged_in_small_photo_count_timeline +
##
       co_tagged_photo_count + small_comments_on_large_status_count_action +
##
       small_likes_large_status_count_action + small_is_tagged_in_large_photo_count_timeline
##
## Final Model:
## friended ~ small_likes_large_post_count_timeline + large_is_tagged_in_small_status_count_action +
##
       small_comments_on_large_post_count_timeline + small_is_tagged_in_large_post_count_timeline +
##
       small_is_tagged_in_large_post_count_action + large_is_tagged_in_small_post_count_timeline +
##
       small_comments_on_large_status_count_timeline + co_like_post_count +
##
       large_posts_photo_video_to_small_timeline_count + large_comments_on_small_post_count_timeline +
##
       small_is_tagged_in_large_status_count_timeline + large_comments_on_small_post_count_action +
##
       large_is_tagged_in_small_post_count_action + co_comment_status_count +
##
       large_is_tagged_in_small_status_count_timeline + co_like_photo_count +
##
       large_likes_small_post_count_action + small_comments_on_large_photo_count_action +
##
       co_tagged_post_count + large_likes_small_status_count_action +
##
       small_posts_post_to_large_timeline_count + small_likes_large_photo_count_action +
##
       large_comments_on_small_status_count_timeline + co_attended_event_count +
##
       small_comments_on_large_photo_count_timeline + small_posts_photo_video_to_large_timeline_count +
##
       large_posts_post_to_small_timeline_count + small_is_tagged_in_large_status_count_action +
##
       large_is_tagged_in_small_photo_count_action + co_tagged_status_count +
##
       large_likes_small_post_count_timeline + small_likes_large_post_count_action +
##
       large likes small status count timeline + small likes large photo count timeline +
##
       large_likes_small_photo_count_action + co_comment_photo_count +
##
       small_comments_on_large_post_count_action + small_likes_large_status_count_timeline +
##
       large_comments_on_small_photo_count_action + large_comments_on_small_status_count_action +
```

```
##
       small_is_tagged_in_large_photo_count_action + large_likes_small_photo_count_timeline +
##
       co_comment_post_count + large_is_tagged_in_small_photo_count_timeline +
##
       co_tagged_photo_count + small_comments_on_large_status_count_action +
##
       small_likes_large_status_count_action + small_is_tagged_in_large_photo_count_timeline
##
##
##
     Step Df Deviance Resid. Df Resid. Dev
                                                ATC
## 1
                                  189.4723 275.4723
summary(logistic3)
##
## Call:
  glm(formula = friended ~ small_likes_large_post_count_timeline +
##
       large_is_tagged_in_small_status_count_action + small_comments_on_large_post_count_timeline +
##
       small_is_tagged_in_large_post_count_timeline + small_is_tagged_in_large_post_count_action +
##
       large_is_tagged_in_small_post_count_timeline + small_comments_on_large_status_count_timeline +
##
       co like post count + large posts photo video to small timeline count +
##
       large_comments_on_small_post_count_timeline + small_is_tagged_in_large_status_count_timeline +
##
       large_comments_on_small_post_count_action + large_is_tagged_in_small_post_count_action +
##
       co_comment_status_count + large_is_tagged_in_small_status_count_timeline +
##
       co_like_photo_count + large_likes_small_post_count_action +
       small_comments_on_large_photo_count_action + co_tagged_post_count +
##
##
       large_likes_small_status_count_action + small_posts_post_to_large_timeline_count +
##
       small_likes_large_photo_count_action + large_comments_on_small_status_count_timeline +
##
       co_attended_event_count + small_comments_on_large_photo_count_timeline +
##
       small_posts_photo_video_to_large_timeline_count + large_posts_post_to_small_timeline_count +
##
       small_is_tagged_in_large_status_count_action + large_is_tagged_in_small_photo_count_action +
##
       co_tagged_status_count + large_likes_small_post_count_timeline +
##
       small_likes_large_post_count_action + large_likes_small_status_count_timeline +
##
       small_likes_large_photo_count_timeline + large_likes_small_photo_count_action +
##
       co_comment_photo_count + small_comments_on_large_post_count_action +
##
       small_likes_large_status_count_timeline + large_comments_on_small_photo_count_action +
##
       large_comments_on_small_status_count_action + co_like_status_count +
##
       large comments on small photo count timeline + small is tagged in large photo count action +
##
       large_likes_small_photo_count_timeline + co_comment_post_count +
##
       large_is_tagged_in_small_photo_count_timeline + co_tagged_photo_count +
##
       small_comments_on_large_status_count_action + small_likes_large_status_count_action +
##
       small_is_tagged_in_large_photo_count_timeline, family = binomial(),
##
       data = train)
##
## Deviance Residuals:
##
                      Median
       Min
                 10
                                   30
                                           Max
                      0.0000
                               0.2364
## -2.9428 -0.4465
                                        2.1704
##
## Coefficients: (8 not defined because of singularities)
##
                                                     Estimate Std. Error
## (Intercept)
                                                   -1.087e+00 3.333e-01
                                                   -1.082e+03 2.373e+07
## small_likes_large_post_count_timeline
## large_is_tagged_in_small_status_count_action
                                                     1.442e+01 1.989e+04
## small_comments_on_large_post_count_timeline
                                                    2.131e+01 1.880e+04
## small_is_tagged_in_large_post_count_timeline
                                                   -2.330e+01 2.669e+04
## small_is_tagged_in_large_post_count_action
                                                            NA
                                                                       NA
```

co_like_status_count + large_comments_on_small_photo_count_timeline +

##

```
## large is tagged in small post count timeline
                                                                       NA
                                                    2.261e+00
## small_comments_on_large_status_count_timeline
                                                               2.381e+00
## co like post count
                                                    7.103e-01
                                                               1.299e+00
## large_posts_photo_video_to_small_timeline_count -2.398e+02
                                                               4.745e+07
## large_comments_on_small_post_count_timeline
                                                   -1.965e+02
                                                               2.373e+07
## small is tagged in large status count timeline
                                                    9.851e+02
                                                               2.373e+07
## large comments on small post count action
                                                           NΑ
                                                                       NΑ
## large_is_tagged_in_small_post_count_action
                                                           NA
                                                                       NA
## co comment status count
                                                    2.032e+00
                                                               1.413e+00
## large_is_tagged_in_small_status_count_timeline
                                                   -1.290e+02
                                                               5.733e+04
## co_like_photo_count
                                                   -1.100e+00
                                                               6.876e-01
## large_likes_small_post_count_action
                                                    2.105e+01
                                                               6.900e+03
## small_comments_on_large_photo_count_action
                                                     1.364e+00
                                                               1.605e+00
## co_tagged_post_count
                                                           NA
                                                                       NA
## large_likes_small_status_count_action
                                                    7.297e+01
                                                               3.621e+03
## small_posts_post_to_large_timeline_count
                                                    1.944e+03
                                                               4.745e+07
## small_likes_large_photo_count_action
                                                    9.479e-01
                                                               7.007e-01
## large comments on small status count timeline
                                                   -1.057e+02
                                                               8.693e+03
                                                    5.057e-01 2.704e-01
## co_attended_event_count
## small_comments_on_large_photo_count_timeline
                                                   -2.003e-02
                                                               9.906e-01
## small_posts_photo_video_to_large_timeline_count -1.363e+02 4.745e+07
## large_posts_post_to_small_timeline_count
                                                   -1.924e+03 4.745e+07
## small_is_tagged_in_large_status_count_action
                                                   -9.740e+02
                                                               2.373e+07
## large is tagged in small photo count action
                                                     1.303e+02
                                                               4.745e+07
## co tagged status count
                                                           NA
                                                                       NA
## large likes small post count timeline
                                                           NA
                                                                       NA
## small_likes_large_post_count_action
                                                    1.085e+03
                                                               2.373e+07
## large_likes_small_status_count_timeline
                                                    -7.076e+01
                                                               3.621e+03
## small_likes_large_photo_count_timeline
                                                   -6.905e-02
                                                               6.533e-01
## large_likes_small_photo_count_action
                                                    6.805e+00
                                                               2.820e+00
## co_comment_photo_count
                                                   -2.858e-01
                                                               1.290e+00
## small_comments_on_large_post_count_action
                                                           NA
                                                                       NA
## small_likes_large_status_count_timeline
                                                   -1.760e+00
                                                               1.932e+00
## large_comments_on_small_photo_count_action
                                                               1.783e+03
                                                    1.305e+01
## large_comments_on_small_status_count_action
                                                    1.243e+02
                                                               6.641e+03
                                                   -2.108e-01 1.478e+00
## co_like_status_count
## large comments on small photo count timeline
                                                   -1.179e+01 1.783e+03
## small_is_tagged_in_large_photo_count_action
                                                    2.222e+02 4.745e+07
## large_likes_small_photo_count_timeline
                                                   -4.834e+00
                                                               2.497e+00
## co_comment_post_count
                                                   -1.914e+01 3.506e+04
## large is tagged in small photo count timeline
                                                   -1.147e+02 4.745e+07
## co tagged photo count
                                                    2.030e+02 4.745e+07
## small_comments_on_large_status_count_action
                                                   -1.444e+00 2.421e+00
## small_likes_large_status_count_action
                                                    2.769e+00 2.035e+00
## small_is_tagged_in_large_photo_count_timeline
                                                   -2.024e+02 4.745e+07
##
                                                   z value Pr(>|z|)
## (Intercept)
                                                    -3.261 0.00111 **
## small_likes_large_post_count_timeline
                                                     0.000 0.99996
## large_is_tagged_in_small_status_count_action
                                                     0.001 0.99942
## small_comments_on_large_post_count_timeline
                                                     0.001
                                                            0.99910
## small_is_tagged_in_large_post_count_timeline
                                                     -0.001
                                                            0.99930
## small_is_tagged_in_large_post_count_action
                                                        NA
                                                                  NA
## large_is_tagged_in_small_post_count_timeline
                                                        NΑ
                                                                  NΑ
## small comments on large status count timeline
                                                     0.950
                                                            0.34230
```

```
## co like post count
                                                     0.547 0.58440
## large_posts_photo_video_to_small_timeline_count
                                                     0.000 1.00000
## large comments on small post count timeline
                                                     0.000 0.99999
## small_is_tagged_in_large_status_count_timeline
                                                     0.000 0.99997
## large_comments_on_small_post_count_action
                                                        NA
                                                                 NA
## large is tagged in small post count action
                                                        NA
                                                                 NA
## co comment status count
                                                     1.439 0.15024
## large_is_tagged_in_small_status_count_timeline
                                                    -0.002 0.99821
## co like photo count
                                                    -1.600
                                                            0.10966
## large_likes_small_post_count_action
                                                     0.003 0.99757
## small_comments_on_large_photo_count_action
                                                     0.850 0.39542
## co_tagged_post_count
                                                        NA
                                                                 NA
## large_likes_small_status_count_action
                                                     0.020 0.98392
## small_posts_post_to_large_timeline_count
                                                     0.000 0.99997
## small_likes_large_photo_count_action
                                                     1.353 0.17616
## large_comments_on_small_status_count_timeline
                                                    -0.012 0.99029
## co_attended_event_count
                                                     1.870 0.06144 .
## small comments on large photo count timeline
                                                    -0.020 0.98387
## small_posts_photo_video_to_large_timeline_count
                                                     0.000 1.00000
## large posts post to small timeline count
                                                     0.000 0.99997
## small_is_tagged_in_large_status_count_action
                                                     0.000 0.99997
## large_is_tagged_in_small_photo_count_action
                                                     0.000
                                                            1.00000
## co_tagged_status_count
                                                        NA
                                                                 NA
## large likes small post count timeline
                                                                 NA
                                                        NΑ
                                                     0.000 0.99996
## small_likes_large_post_count_action
## large likes small status count timeline
                                                    -0.020 0.98441
## small_likes_large_photo_count_timeline
                                                    -0.106 0.91583
                                                     2.414 0.01580 *
## large_likes_small_photo_count_action
                                                    -0.222 0.82458
## co_comment_photo_count
## small_comments_on_large_post_count_action
                                                        NA
                                                                 NA
## small_likes_large_status_count_timeline
                                                    -0.911 0.36231
## large_comments_on_small_photo_count_action
                                                     0.007 0.99416
## large_comments_on_small_status_count_action
                                                     0.019 0.98507
## co_like_status_count
                                                    -0.143 0.88661
## large comments on small photo count timeline
                                                    -0.007 0.99472
## small_is_tagged_in_large_photo_count_action
                                                     0.000 1.00000
## large likes small photo count timeline
                                                    -1.936 0.05288
## co_comment_post_count
                                                    -0.001 0.99956
## large_is_tagged_in_small_photo_count_timeline
                                                     0.000 1.00000
## co_tagged_photo_count
                                                     0.000 1.00000
## small comments on large status count action
                                                    -0.596 0.55096
## small_likes_large_status_count_action
                                                     1.361 0.17350
## small_is_tagged_in_large_photo_count_timeline
                                                     0.000 1.00000
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
       Null deviance: 470.29
                             on 349
                                      degrees of freedom
## Residual deviance: 189.47
                             on 307 degrees of freedom
## AIC: 275.47
## Number of Fisher Scoring iterations: 21
```