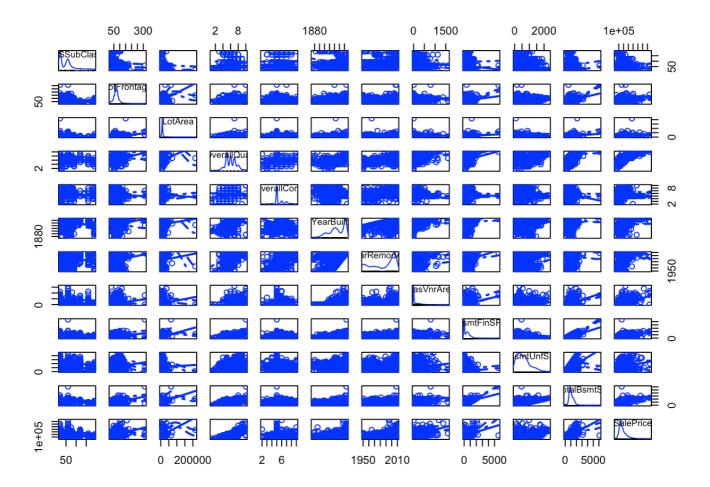
lab2

```
[1] "Id"
                         "MSSubClass"
                                          "MSZoning"
                                                           "LotFrontage"
##
                         "Street"
                                           "Alley"
                                                           "LotShape"
##
    [5] "LotArea"
##
   [9] "LandContour"
                         "Utilities"
                                          "LotConfig"
                                                           "LandSlope"
                         "Condition1"
                                          "Condition2"
                                                           "BldqType"
## [13] "Neighborhood"
## [17] "HouseStyle"
                         "OverallQual"
                                          "OverallCond"
                                                           "YearBuilt"
                                                           "Exterior1st"
## [21] "YearRemodAdd"
                         "RoofStyle"
                                          "RoofMatl"
                                                           "ExterQual"
## [25] "Exterior2nd"
                         "MasVnrType"
                                          "MasVnrArea"
## [29] "ExterCond"
                         "Foundation"
                                          "BsmtQual"
                                                           "BsmtCond"
                                                           "BsmtFinType2"
## [33] "BsmtExposure"
                         "BsmtFinType1"
                                          "BsmtFinSF1"
                         "BsmtUnfSF"
## [37] "BsmtFinSF2"
                                          "TotalBsmtSF"
                                                           "Heating"
## [41] "HeatingQC"
                         "CentralAir"
                                          "Electrical"
                                                           "X1stFlrSF"
## [45] "X2ndFlrSF"
                         "LowQualFinSF"
                                          "GrLivArea"
                                                           "BsmtFullBath"
                                          "HalfBath"
                                                           "BedroomAbvGr"
## [49] "BsmtHalfBath"
                         "FullBath"
                         "KitchenQual"
                                          "TotRmsAbvGrd"
                                                           "Functional"
## [53] "KitchenAbvGr"
## [57] "Fireplaces"
                         "FireplaceQu"
                                          "GarageType"
                                                           "GarageYrBlt"
## [61] "GarageFinish"
                         "GarageCars"
                                           "GarageArea"
                                                           "GarageQual"
                         "PavedDrive"
                                          "WoodDeckSF"
## [65] "GarageCond"
                                                           "OpenPorchSF"
## [69] "EnclosedPorch" "X3SsnPorch"
                                          "ScreenPorch"
                                                           "PoolArea"
## [73] "PoolQC"
                         "Fence"
                                                           "MiscVal"
                                          "MiscFeature"
                                                           "SaleCondition"
                         "YrSold"
                                          "SaleType"
## [77] "MoSold"
## [81] "SalePrice"
```

```
## Loading required package: carData
```

```
ameslist_plot <- ameslist[c(2,4:5,18:21,27,35,38:39,81)]
scatterplotMatrix(ameslist_plot)</pre>
```



From the plot, we see SalePrice seems highly correlated with OverallQual, YearBuilt, YearRemodAdd, MaxVnrArea

1.3

Ames matrix <- matrix(unlist(Ames), 1460, 45)

Warning in matrix(unlist(Ames), 1460, 45): 数据长度[55480]不是矩阵列数[45] ## 的整倍数

cor_value <- cor(Ames_matrix)
cor value</pre>

```
## [,1] [,2] [,3] [,4] [,5]
## [1,] 1.000000000 0.011156478 NA -0.033225519 -0.02836475
```

```
##
        0.0111564782 1.000000000
                                     NA -0.139781082
    [2,]
                                                      0.03262771
##
    [3,]
                   NA
                                                  NA
                                        1.000000000 0.10580574
##
    [4,] -0.0332255186 -0.139781082
                                     NA
##
    [5,] -0.0283647539 0.032627708
                                     NA 0.105805742 1.00000000
##
    [6,] 0.0126089248 -0.059315817
                                     NA -0.005636270 -0.09193234
##
    [7,] -0.0127127154 0.027850137
                                     NA
                                        0.014227652 0.57232277
##
    [8,] -0.0219976419
                       0.040581045
                                        0.013788427
                                                      0.55068392
                                     NA
##
                                     NA
    [9,1
                                                  NΑ
## [10,] -0.0050240490 -0.069835749
                                     NA 0.214103131 0.23966597
## [11,] -0.0059676720 -0.065648579
                                     NA
                                        0.111169745 -0.05911869
## [12,] -0.0079397034 -0.140759481
                                     NA -0.002618360 0.30815893
## [13,] -0.0154145661 -0.238518409
                                     NA
                                        0.260833135 0.53780850
## [14,] 0.0104960410 -0.251758352
                                     NΑ
                                        0.299474579 0.47622383
## [15,] 0.0055898489 0.307885721
                                     NA
                                        0.050985948 0.29549288
## [16,] -0.0442299581 0.046473756
                                     NA
                                         0.004778970 -0.03042928
## [17,] 0.0082727577 0.074853180
                                         0.263116167 0.59300743
## [18,] 0.0022885556 0.003491026
                                     NA
                                         0.158154531 0.11109779
## [19,] -0.0201547452 -0.002332535
                                     NA 0.048045571 -0.04015016
## [20,] 0.0055874529 0.131608222
                                     NA
                                         0.126030627 0.55059971
## [21,] 0.0067838113 0.177354389
                                     NA
                                        0.014259469 0.27345810
## [22,] 0.0377185542 -0.023438028
                                        0.119689908 0.10167636
                                     NA
## [23,] 0.0029512364 0.281721040
                                     NA -0.017783871 -0.18388223
## [24,] 0.0272387244 0.040380065
                                        0.190014778
                                                      0.42745234
## [25,] -0.0197716324 -0.045569340
                                     NA
                                         0.271364010
                                                      0.39676504
## [26,]
                   NA
                                     NA
                                                  NA
                                                              NA
## [27,] 0.0165696771 -0.040109793
                                     NA 0.154870740 0.60067072
## [28,] 0.0176337785 -0.098671543
                                     NA 0.180402755 0.56202176
## [29,] -0.0296431972 -0.012579358
                                     NA
                                        0.171697687 0.23892339
## [30,] -0.0004769113 -0.006100121
                                     NA 0.084773809 0.30881882
## [31,] 0.0028892179 -0.012036622
                                     NA -0.018339734 -0.11393686
## [32,] -0.0466347889 -0.043824549
                                     NA 0.020422830 0.03037057
## [33,] 0.0013302086 -0.026030177
                                     NA 0.043160378 0.06488636
## [34,] 0.0570439048 0.008282708
                                     NA 0.077672392 0.06516584
## [35,] -0.0062424048 -0.007683291
                                     NA 0.038067692 -0.03140621
## [36,] 0.0211721766 -0.013584643
                                     NA 0.001204988 0.07081517
## [37,] 0.0007117940 -0.021407038
                                     NA -0.014261407 -0.02734671
## [38,] -0.0219167194 -0.084284135
                                        0.263843354 0.79098160
## [39,] 1.000000000 0.011156478
                                     NA -0.033225519 -0.02836475
                                     NA -0.139781082 0.03262771
## [40,] 0.0111564782 1.000000000
## [41,]
                   NA
                                NA
                                     NA
                                                  NA
                                                              NA
                                     NA 1.000000000 0.10580574
## [42,] -0.0332255186 -0.139781082
## [43,] -0.0283647539 0.032627708
                                     NA 0.105805742 1.00000000
## [44,] 0.0126089248 -0.059315817
                                     NA -0.005636270 -0.09193234
## [45,] -0.0127127154
                       0.027850137
                                        0.014227652 0.57232277
##
                [,6]
                             [,7]
                                          [,8] [,9]
                                                           [,10]
    [1,] 0.012608925 -0.012712715 -0.021997642
                                                 NA -0.005024049
##
##
    [2,] -0.059315817  0.027850137  0.040581045
                                                 NA -0.069835749
##
                                                 NΑ
    [3,]
                  NA
                               NA
                                            NA
                                                              NA
##
    [4,] -0.005636270 0.014227652 0.013788427
                                                 NA 0.214103131
##
    [5,] -0.091932343 0.572322769 0.550683924
                                                 NA 0.239665966
```

```
##
    [6,1
         1.000000000 -0.375983196 0.073741498
                                                 NA -0.046230856
                                                     0.249503197
##
    [7,] -0.375983196 1.000000000
                                   0.592854976
    [8,] 0.073741498 0.592854976
##
                                   1.000000000
                                                 NA
                                                     0.128450547
##
    [9,]
                  NA
                               NA
                                                  1
                                            NA
                                                              NA
## [10,] -0.046230856 0.249503197
                                   0.128450547
                                                     1.000000000
                                                 NA
## [11,] 0.040229170 -0.049106831 -0.067758514
                                                 NA -0.050117400
## [12,] -0.136840570 0.149040392
                                                 NA -0.495251469
                                   0.181133087
## [13,] -0.171097515 0.391452002
                                   0.291065583
                                                     0.522396052
## [14,] -0.144202784 0.281985859
                                   0.240379268
                                                     0.445862656
## [15,] 0.028942116 0.010307660 0.140023779
                                                 NA -0.137078986
## [16,] 0.025494320 -0.183784344 -0.062419100
                                                 NA -0.064502597
## [17,] -0.079685865 0.199009714
                                                     0.208171130
                                   0.287388520
                                                 NA
                                                     0.649211754
## [18,] -0.054941515 0.187598550 0.119469879
                                                 NΑ
## [19,] 0.117820915 -0.038161806 -0.012337032
                                                    0.067418478
                                                 NΑ
## [20,] -0.194149489 0.468270787
                                   0.439046484
                                                 NA
                                                     0.058543137
## [21,] -0.060769327 0.242655910
                                   0.183330612
                                                     0.004262424
## [22,] 0.012980060 -0.070651217 -0.040580928
                                                 NA - 0.107354677
## [23,] -0.087000855 -0.174800246 -0.149597521
                                                 NA -0.081006851
## [24,] -0.057583166
                     0.095589128
                                   0.191739816
                                                 NA
                                                     0.044315624
## [25,] -0.023819978 0.147716399
                                   0.112581318
                                                 NA
                                                     0.260010920
## [26,]
                  NA
                               NΑ
                                            NA
                                                 NA
                                                              NA
## [27,] -0.185757511 0.537850092
                                                     0.224053522
                                   0.420622155
                                                 NA
## [28,] -0.151521371 0.478953820
                                   0.371599809
                                                     0.296970385
## [29,] -0.003333699 0.224880142 0.205725920
                                                 NA
                                                     0.204306145
NA
                                                     0.111760613
## [31,] 0.070356184 -0.387267783 -0.193919147
                                                 NA -0.102303306
## [32,] 0.025503660 0.031354513 0.045285810
                                                 NA 0.026450506
## [33,]
         0.054810529 - 0.050364435 - 0.038740011
                                                 NA
                                                    0.062020623
## [34,] -0.001984942 0.004949728 0.005829372
                                                 NA
                                                     0.140491286
## [35,]
         0.068776806 - 0.034383139 - 0.010286249
                                                     0.003571473
## [36,] -0.003510839 0.012398471 0.021490002
                                                 NA -0.015726948
## [37,]
         0.043949746 - 0.013617680 \ 0.035743247
                                                 NA
                                                    0.014358922
## [38,] -0.077855894 0.522897333
                                   0.507100967
                                                     0.386419806
                                                 NΑ
## [39,] 0.012608925 -0.012712715 -0.021997642
                                                 NA -0.005024049
## [40,] -0.059315817 0.027850137
                                   0.040581045
                                                 NA -0.069835749
## [41,]
                  NA
                               NΑ
                                            NΑ
                                                 NΑ
                                                              NA
## [42,] -0.005636270 0.014227652
                                   0.013788427
                                                 NA
                                                     0.214103131
## [43,] -0.091932343 0.572322769 0.550683924
                                                     0.239665966
## [44,] 1.000000000 -0.375983196 0.073741498
                                                 NA -0.046230856
## [45,] -0.375983196
                     1.000000000 0.592854976
                                                 NA
                                                     0.249503197
##
                            [,12]
                                                       [,14]
               [,11]
                                          [,13]
                                                                    [,15]
##
    [1,] -0.005967672 -0.007939703 -0.0154145661
                                                 0.010496041
                                                              0.005589849
##
    [2,] -0.065648579 -0.140759481 -0.2385184093 -0.251758352
                                                              0.307885721
##
    [3,]
                  NA
                               NA
                                             NA
                                                          NA
                                                                       NA
##
    [4,] 0.111169745 -0.002618360 0.2608331345
                                                 0.299474579
                                                              0.050985948
    [5,] -0.059118693 0.308158927
                                                              0.295492879
##
                                   0.5378084986
                                                 0.476223829
##
         0.040229170 - 0.136840570 - 0.1710975146 - 0.144202784
                                                              0.028942116
    [6,]
##
    [7,] -0.049106831 0.149040392 0.3914520021 0.281985859
                                                              0.010307660
##
    [8,] -0.067758514 0.181133087 0.2910655826
                                                 0.240379268
                                                              0.140023779
##
    [9,]
                  NA
                               NΑ
                                             NA
                                                          NA
                                                                       NA
```

```
## [10,] -0.050117400 -0.495251469 0.5223960520 0.445862656 -0.137078986
## [11,] 1.000000000 -0.209294492 0.1048095376
                                             0.097117448 - 0.099260316
## [12,] -0.209294492 1.000000000 0.4153596052 0.317987438 0.004469092
## [13,] 0.104809538 0.415359605 1.0000000000 0.819529975 -0.174511950
## [14,] 0.097117448 0.317987438 0.8195299750 1.000000000 -0.202646181
## [16,] 0.014806998 0.028166688 -0.0332453873 -0.014240673 0.063352950
0.566023969 0.687501064
## [18,] 0.158678061 -0.422900477
                                0.3073505537
                                             0.244671104 - 0.169493952
## [19,] 0.070948134 -0.095804288 -0.0003145818
                                             0.001955654 - 0.023854784
## [20,] -0.076443862 0.288886055 0.3237224136
                                             0.380637495 0.421377983
## [21,] -0.032147837 -0.041117530 -0.0488037386 -0.119915909
                                                        0.609707300
                                                        0.502900613
## [22,] -0.015728114 0.166643317
                                0.0504499555
                                             0.127400749
0.068100588
                                                        0.059305753
## [24,] -0.035226548 0.250647061
                                0.2855725637
                                             0.409515979
                                                         0.616422635
## [25,] 0.046920709 0.051574882
                                0.3395193239
                                             0.410531085
                                                        0.194560892
## [26,]
                 NA
                            NA
                                         NA
                                                     NA
                                                                NA
0.439316808
                                                        0.183925583
0.489781654
                                                        0.138346959
## [29,] 0.067898326 -0.005316424 0.2320186091
                                             0.235458623
                                                        0.092165418
## [30,] 0.003092562 0.129005415 0.2472637463
                                             0.211671225
                                                        0.208026063
## [31,] 0.036543339 -0.002537855 -0.0954777367 -0.065291701
                                                        0.061988691
## [32,] -0.029993398 0.020764006
                                0.0373837273
                                             0.056104374 - 0.024357648
## [33,] 0.088871251 -0.012579273 0.0844889859
                                             0.088758073
                                                        0.040606448
## [34,] 0.041709055 -0.035092241 0.1260531321 0.131524976
                                                        0.081486878
## [35,] 0.004939781 -0.023836645 -0.0184789224 -0.021095719
                                                        0.016196875
0.035164427
## [37,]
         0.031705637 - 0.041258195 - 0.0149686480 - 0.013603771 - 0.028699914
## [38,] -0.011378121 0.214479106 0.6135805516 0.605852185
                                                       0.319333803
## [39,] -0.005967672 -0.007939703 -0.0154145661
                                             0.010496041
                                                         0.005589849
## [40,] -0.065648579 -0.140759481 -0.2385184093 -0.251758352
                                                        0.307885721
## [41,]
                 NA
                            NA
                                         NA
                                                                NA
                                                     NA
## [42,] 0.111169745 -0.002618360 0.2608331345
                                             0.299474579
                                                        0.050985948
## [43,] -0.059118693  0.308158927  0.5378084986  0.476223829
                                                        0.295492879
         0.040229170 \ -0.136840570 \ -0.1710975146 \ -0.144202784
## [44,]
                                                        0.028942116
## [45,] -0.049106831 0.149040392 0.3914520021 0.281985859 0.010307660
##
                           [,17]
                                       [,18]
               [,16]
                                                    [,19]
                                                                 [,20]
##
   [1,] -0.0442299581 0.008272758
                                0.0022885556 -0.0201547452
                                                          0.0055874529
   [2,] 0.0464737559
                                 0.0034910258 - 0.0023325346
##
                     0.074853180
                                                          0.1316082224
##
                  NA
                             NA
                                          NA
                                                       NA
                                                                   NA
   [3,]
##
   [4,] 0.0047789699
                     0.263116167
                                 0.1581545311 0.0480455709
                                                          0.1260306265
##
                                 0.1110977861 -0.0401501577
                                                          0.5505997094
   [5,] -0.0304292840 0.593007430
##
   [6,]
         0.0254943199 \ -0.079685865 \ -0.0549415154 \ \ 0.1178209151 \ -0.1941494887
##
   [7,] -0.1837843444
                     0.199009714
                                 0.1875985500 -0.0381618057
                                                          0.4682707872
##
   [8,] -0.0624191001
                     0.287388520
                                 0.1194698791 -0.0123370321
                                                          0.4390464839
##
   [9,]
                             NA
                                          NA
                                                                   NA
## [10,] -0.0645025969
                     0.208171130 0.6492117536 0.0674184779 0.0585431369
## [11,] 0.0148069979 -0.009639892 0.1586780608 0.0709481337 -0.0764438620
## [12,] 0.0281666881 0.240257268 -0.4229004774 -0.0958042882 0.2888860555
## [13,] -0.0332453873     0.454868203     0.3073505537     -0.0003145818     0.3237224136
```

```
\#\# [14,] -0.0142406727 0.566023969 0.2446711042 0.0019556536 0.3806374950
## [15,] 0.0633529501 0.687501064 -0.1694939517 -0.0238547839 0.4213779829
## [16,] 1.0000000000 0.134682813 -0.0471434219 -0.0058415048 -0.0007095096
## [17,] 0.1346828130 1.000000000 0.0348360495 -0.0189184832 0.6300116463
                       0.034836050 1.0000000000 -0.1478709605 -0.0645120486
## [18,] -0.0471434219
\#\# [19,] -0.0058415048 -0.018918483 -0.1478709605 1.0000000000 -0.0545358120
## [20,] -0.0007095096
                        0.630011646 - 0.0645120486 - 0.0545358120 1.0000000000
## [21,] -0.0270800493
                        0.415771636 - 0.0309049591 - 0.0123399001 0.1363805887
## [22,] 0.1056065685
                        0.521269511 - 0.1506728092 0.0465188484
                                                               0.3632519830
## [23,] 0.0075217443
                        0.100063165 - 0.0415025464 - 0.0379443502
                                                               0.1331152142
## [24,] 0.1311847760
                        0.825489374 - 0.0532752361 - 0.0238363413 0.5547842535
## [25,] -0.0212721434
                        0.461679134 0.1379277084 0.0289755866
                                                                0.2436705031
## [26,]
                   NA
                                NΑ
                                              NΑ
                                                            NΑ
                                                                          NA
## [27,] -0.0944795202
                       0.467247419 0.1318812244 -0.0208910590
                                                               0.4696720433
## [28,] -0.0676014132
                        0.468997477 0.1791894804 -0.0245355796
                                                                0.4056562085
## [29,] -0.0254436480
                        0.247432821 0.1753151901 0.0401612233
                                                               0.1877032138
## [30,] 0.0182510391 0.330223962 0.0673414614 -0.0253237579 0.2599774255
## [31,]
         0.0610812378
                       0.009113210 - 0.0499106491 - 0.0085553339 - 0.1150929635
                       0.020643190 - 0.0001060915 \ 0.0351136309 \ 0.0353530166
## [32,] -0.0042956104
## [33,] 0.0267994130 0.101510396 0.0231477258 0.0321214072 -0.0081060933
## [34,] 0.0621573723 0.170205336 0.0676155562 0.0200246298 0.0496038256
\#\# [35,] -0.0037928708 -0.002415640 -0.0230470249 -0.0073665245 -0.0142898450
## [36,] -0.0221739606
                       0.050239681 - 0.0253608943 0.0328727052
                                                               0.0558721290
\#\# [37,] -0.0289208798 -0.036525820 0.0670491377 -0.0465238818 -0.0196688407
## [38,] -0.0256061300 0.708624478 0.2271222331 -0.0168441543 0.5606637627
## [39,] -0.0442299581
                       0.008272758 0.0022885556 -0.0201547452
                                                               0.0055874529
## [40,] 0.0464737559 0.074853180 0.0034910258 -0.0023325346 0.1316082224
## [41,]
                                NA
                                              NΑ
                                                            NA
                   NA
                                                                          NA
## [42,] 0.0047789699 0.263116167 0.1581545311 0.0480455709 0.1260306265
## [43,] -0.0304292840 0.593007430
                                   0.1110977861 -0.0401501577 0.5505997094
## [44,] 0.0254943199 -0.079685865 -0.0549415154 0.1178209151 -0.1941494887
## [45,] -0.1837843444 0.199009714 0.1875985500 -0.0381618057 0.4682707872
##
                             [,22]
                                         [,23]
                                                      [,24]
                [,21]
                                                                   [,25]
##
        0.006783811 0.037718554 0.002951236 0.027238724 -0.019771632
    [1,]
        0.177354389 - 0.023438028 \ 0.281721040 \ 0.040380065 - 0.045569340
##
    [2,]
##
    [3,]
                  NΑ
                               NΑ
                                            NΑ
                                                         NΑ
##
    [4,] 0.014259469 0.119689908 -0.017783871
                                                0.190014778 0.271364010
##
         0.273458099 0.101676356 -0.183882235
                                                0.427452343
                                                            0.396765038
    [5,]
    [6,] -0.060769327 0.012980060 -0.087000855 -0.057583166 -0.023819978
##
##
          0.242655910 - 0.070651217 - 0.174800246
                                               0.095589128
                                                             0.147716399
    [7,]
    [8,] 0.183330612 -0.040580928 -0.149597521 0.191739816 0.112581318
##
##
                  NA
                               NA
    [9,]
                                                         NA
                                                                      NA
## [10,] 0.004262424 -0.107354677 -0.081006851
                                                0.044315624 0.260010920
## [11,] -0.032147837 -0.015728114 -0.040751236 -0.035226548
                                                             0.046920709
## [12,] -0.041117530 0.166643317 0.030085868
                                                0.250647061
                                                             0.051574882
## [13,] -0.048803739 0.050449956 -0.068900643
                                                0.285572564
                                                             0.339519324
## [14,] -0.119915909 0.127400749 0.068100588 0.409515979
                                                             0.410531085
## [15,] 0.609707300 0.502900613 0.059305753 0.616422635 0.194560892
## [16,] -0.027080049 0.105606569 0.007521744 0.131184776 -0.021272143
## [17,] 0.415771636 0.521269511 0.100063165 0.825489374 0.461679134
```

```
\#\# [18,] -0.030904959 -0.150672809 -0.041502546 -0.053275236 0.137927708
## [19,] -0.012339900 0.046518848 -0.037944350 -0.023836341 0.028975587
## [20,] 0.136380589 0.363251983 0.133115214 0.554784254
                                                             0.243670503
## [21,] 1.000000000 0.226651484 -0.068262549 0.343414858
                                                             0.203648508
## [22,]
         0.226651484 1.000000000 0.198596758 0.676619936
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## [23,] -0.068262549
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                                   0.256045409
                                                1.000000000
## [24,]
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## [25,]
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                                                             1.00000000
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## [26,]
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## [27,]
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                                                             0.300788766
         0.163549364 0.065252530 -0.064433047
## [28,]
                                                0.337822121
                                                             0.269141238
## [29,]
         0.165983884
                                                             0.200018796
         0.199740148 0.093809572 -0.070090610
## [30,]
                                                0.234191588
                                                             0.169405327
## [31,] -0.095316526  0.041570435  0.037312385
                                                0.004151299 -0.024821869
## [32,] -0.004972488 -0.024477796 -0.024600359 -0.006683241
                                                             0.011257239
## [33,] 0.072425845 0.044299691 -0.051613366 0.059382600
                                                             0.184530270
## [34,] 0.022381498 0.070702584 -0.014525116
                                               0.083757350
                                                             0.095073522
## [35,]
          0.001290145 0.007766972 0.062340724 0.024762884
                                                             0.001408605
## [36,] -0.009049888 0.046543860 0.026588907
                                                0.036907077
                                                             0.046357102
## [37,] -0.010268669 -0.036013893 0.031687207 -0.034516354 -0.024095565
          0.284107676 0.168213154 -0.135907371
                                                0.533723156 0.466928837
## [38,]
## [39,]
          0.006783811
                     0.037718554 0.002951236
                                                0.027238724 - 0.019771632
## [40,]
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                                   0.281721040
                                                0.040380065 -0.045569340
## [41,]
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                               NΑ
                                            NA
                                                         NA
                                                                      NΑ
          0.014259469 0.119689908 -0.017783871
## [42,]
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          0.273458099 0.101676356 -0.183882235 0.427452343
                                                            0.396765038
## [43,]
## [44,] -0.060769327 0.012980060 -0.087000855 -0.057583166 -0.023819978
          0.242655910 - 0.070651217 - 0.174800246 \ 0.095589128 \ 0.147716399
## [45,]
##
         [,26]
                     [,27]
                                [,28]
                                             [,29]
                                                           [,30]
##
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    [1,]
##
   [2,]
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##
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                                   NA
                                                NA
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   [3,]
                       NA
##
               0.15487074
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                                       0.171697687
                                                    0.0847738088
    [4,]
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##
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                          0.56202176 0.238923392
                                                   0.3088188234
   [5,]
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##
           NA -0.18575751 -0.15152137 -0.0033333699 -0.0325888135
   [6,]
##
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                                       0.224880142 0.1886858400
    [7,]
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##
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    [8,]
##
   [9,]
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                                                NA
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                          0.29697039
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## [10,]
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               0.22405352
                                                   0.1117606134
           NA -0.03826351 -0.01822659
                                       0.067898326
                                                    0.0030925622
## [11,]
## [12,]
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               0.21417519 0.18330270 -0.005316424
                                                   0.1290054146
               0.43458483 0.48666546
                                       0.232018609
                                                   0.2472637463
## [13,]
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## [14,]
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## [17,]
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## [18,]
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                           0.17918948
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                                                    0.0673414614
## [19,]
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## [20,]
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                                       0.187703214
                                                    0.2599774255
           NΑ
                                       0.108080303 0.1997401475
## [21,]
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               0.21917815 0.16354936
```

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## [22,]
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## [23,]
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## [24,]
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                         0.33782212
                                    0.165983884 0.2341915878
## [25,]
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## [26,]
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                                 NΑ
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                                                           NΑ
## [27,]
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## [28,]
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## [29,]
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## [30,]
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## [31,]
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## [32,]
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              0.05049379 0.05141176 -0.074181351 0.0743039439
## [33,]
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              ## [34,]
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## [35,]
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## [36,]
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## [37,]
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## [38,]
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## [39,]
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           NA -0.04010979 -0.09867154 -0.012579358 -0.0061001212
## [40,]
## [41,]
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                      NA
                                 NA
                                             NA
                                                           NA
## [42,]
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           NA
## [43,]
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## [44,]
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## [45,]
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##
               [,31]
                            [,32]
                                        [,33]
                                                    [,34]
                                                                 [,35]
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##
   [2,] -0.012036622 -0.0438245492 -0.026030177 0.008282708 -0.0076832913
##
##
                                                       NA
                               NA
                                           NA
    [4,] -0.018339734  0.0204228296  0.043160378
                                               0.077672392 0.0380676920
##
##
   [5,] -0.113936859 0.0303705671
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                                               0.065165844 - 0.0314062105
##
   [6,] 0.070356184 0.0255036600 0.054810529 -0.001984942 0.0687768061
##
   [8,] -0.193919147 0.0452858098 -0.038740011
##
                                               0.005829372 -0.0102862488
##
   [9,]
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                              NA
                                           NΑ
                                                       NΑ
                                                                    NΑ
## [10,] -0.102303306 0.0264505062
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## [11,] 0.036543339 -0.0299933980
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## [12,] -0.002537855  0.0207640057 -0.012579273 -0.035092241 -0.0238366451
## [13,] -0.095477737 0.0373837273 0.084488986
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## [14,] -0.065291701 0.0561043745 0.088758073
## [15,] 0.061988691 -0.0243576484 0.040606448
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## [16,] 0.061081238 -0.0042956104 0.026799413
## [17,] 0.009113210 0.0206431897 0.101510396
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## [18,] -0.049910649 -0.0001060915 0.023147726
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## [19,] -0.008555334 0.0351136309 0.032121407
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0.049603826 - 0.0142898450
## [21,] -0.095316526 -0.0049724884 0.072425845
                                               0.022381498 0.0012901448
## [22,] 0.041570435 -0.0244777964 0.044299691
                                               0.070702584 0.0077669720
## [23,] 0.037312385 -0.0246003587 -0.051613366 -0.014525116 0.0623407240
## [24,] 0.004151299 -0.0066832410 0.059382600
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## [25,] -0.024821869 0.0112572390 0.184530270 0.095073522 0.0014086054
```

```
## [26,]
                                 NA
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## [27,] -0.151434160 0.0357652851 0.050493792
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## [28,] -0.121776720 0.0350867002 0.051411762
                                                  0.061047272 - 0.0273999144
## [29,] -0.125988888 -0.0327706336 -0.074181351
                                                 0.073378207 -0.0095512282
## [30,] -0.093079318 -0.0058424993 0.074303944
                                                  0.060762111 -0.0185837390
## [31,]
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## [32,] -0.037305283 1.0000000000 -0.031435847 -0.007991549
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## [33,] -0.082864245 -0.0314358470
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                                                  0.051307395
                                                              0.0319457608
## [34,] 0.054202562 -0.0079915489
                                   0.051307395
                                                  1.000000000
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## [35,] 0.018360600 0.0003539653 0.031945761
                                                  0.029668651
                                                               1.0000000000
## [36,] -0.028887266 0.0294737952 0.023216992 -0.033736640 -0.0064945502
## [37,] -0.009915937 0.0186449254 0.010694106 -0.059688932
                                                               0.0049062625
## [38,] -0.128577958 0.0445836653
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                                                  0.092403549 - 0.0211895796
## [39,]
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                                    0.001330209
                                                  0.057043905 -0.0062424048
## [40,] -0.012036622 -0.0438245492 -0.026030177
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## [41,]
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                                NA
                                              NA
                                                           NA
## [42,] -0.018339734 0.0204228296
                                    0.043160378
                                                  0.077672392
                                                               0.0380676920
0.065165844 - 0.0314062105
## [44,] 0.070356184 0.0255036600 0.054810529 -0.001984942
                                                              0.0687768061
   [45,] -0.387267783  0.0313545131 -0.050364435  0.004949728 -0.0343831387
##
##
                                                                    [,40]
                [,36]
                             [,37]
                                         [,38]
                                                       [,39]
##
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##
    [2,] -0.013584643 -0.021407038 -0.08428414
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##
    [3,]
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                                NΑ
                                            NΑ
                                                          NΑ
                                                                       NΑ
##
    [4,]
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    [5,]
          0.070815172 - 0.027346708 \ 0.79098160 - 0.0283647539
##
##
    \begin{bmatrix} 6, \end{bmatrix} - 0.003510839 \quad 0.043949746 \quad -0.07785589 \quad 0.0126089248 \quad -0.059315817
##
          0.012398471 -0.013617680
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                                                              0.027850137
    [7,]
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    [8,]
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##
                   NA
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                                            NA
                                                         NA
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0.034888443 - 0.041258195 0.21447911 - 0.0079397034 - 0.140759481
## [12,]
## [13,] 0.013196179 -0.014968648 0.61358055 -0.0154145661 -0.238518409
                                               0.0104960410 -0.251758352
## [14,]
        0.031371560 -0.013603771 0.60585218
## [15,]
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## [16,] -0.022173961 -0.028920880 -0.02560613 -0.0442299581
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          0.050239681 -0.036525820
                                    0.70862448
                                                0.0082727577
                                                              0.074853180
## [17,]
## [18,] -0.025360894 0.067049138
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                                                0.0022885556
                                                              0.003491026
## [19,]
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## [20,]
          0.055872129 -0.019668841
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                                                             0.131608222
## [21,] -0.009049888 -0.010268669
                                    0.28410768
                                               0.0067838113 0.177354389
## [22,]
          0.046543860 -0.036013893
                                    0.16821315 0.0377185542 -0.023438028
## [23,]
          0.026588907 0.031687207 -0.13590737
                                                0.0029512364
                                                              0.281721040
## [24,]
         0.036907077 - 0.034516354
                                    0.53372316
                                                0.0272387244
                                                              0.040380065
          0.046357102 - 0.024095565
                                    0.46692884 - 0.0197716324 - 0.045569340
## [25,]
## [26,]
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                                NA
                                            NA
                                                          NA
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## [27,]
## [28,]
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                                                0.0176337785 - 0.098671543
## [29,]
          0.021011044 \quad 0.022270451 \quad 0.32441344 \quad -0.0296431972 \quad -0.012579358
```

```
## [30,] 0.071254885 -0.057619360 0.31585623 -0.0004769113 -0.006100121
## [31,] -0.028887266 -0.009915937 -0.12857796 0.0028892179 -0.012036622
## [32,] 0.029473795 0.018644925 0.04458367 -0.0466347889 -0.043824549
## [33,] 0.023216992 0.010694106 0.11144657 0.0013302086 -0.026030177
## [34,] -0.033736640 -0.059688932 0.09240355 0.0570439048 0.008282708
## [35,] -0.006494550 0.004906262 -0.02118958 -0.0062424048 -0.007683291
## [36,] 1.000000000 -0.145721413 0.04643225 0.0211721766 -0.013584643
## [37,] -0.145721413 1.000000000 -0.02892259 0.0007117940 -0.021407038
## [38,] 0.046432245 -0.028922585 1.00000000 -0.0219167194 -0.084284135
## [39,] 0.021172177 0.000711794 -0.02191672 1.0000000000 0.011156478
## [40,] -0.013584643 -0.021407038 -0.08428414 0.0111564782 1.000000000
                               NA
## [41,]
                  NA
                                          NΑ
                                                        NΑ
                                                                     NΑ
## [42,] 0.001204988 -0.014261407 0.26384335 -0.0332255186 -0.139781082
## [43,] 0.070815172 -0.027346708 0.79098160 -0.0283647539 0.032627708
## [45,] 0.012398471 -0.013617680 0.52289733 -0.0127127154 0.027850137
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##
        [,41]
                            [,43]
                                             [,44]
                                                          [,45]
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##
    [2,]
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                        NA
##
           NA
                                   NΑ
                                                NA
                                                             NA
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##
   [4,]
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##
   [5,]
           NA
##
           NA -0.005636270 -0.09193234 1.000000000 -0.375983196
   [6,]
##
   [7,]
           NA
               0.014227652 0.57232277 -0.375983196 1.000000000
##
   [8,]
           NA
               0.013788427 0.55068392 0.073741498 0.592854976
## [9,]
                                   NA
           NA
                        NΑ
                                                NΑ
                                                             NΑ
              0.214103131 0.23966597 -0.046230856 0.249503197
## [10,]
           NA
               0.111169745 -0.05911869 0.040229170 -0.049106831
## [11,]
           NA
           NA -0.002618360 0.30815893 -0.136840570 0.149040392
## [12,]
## [13,]
               0.260833135 0.53780850 -0.171097515 0.391452002
           NΑ
## [14,]
           NA
               0.299474579 0.47622383 -0.144202784 0.281985859
## [15,]
              0.050985948 0.29549288 0.028942116 0.010307660
           NA
               0.004778970 - 0.03042928  0.025494320 - 0.183784344
## [16,]
           NΑ
## [17,]
              0.263116167 0.59300743 -0.079685865 0.199009714
           NA
               0.158154531 0.11109779 -0.054941515 0.187598550
## [18,]
           NA
## [19,]
               0.048045571 -0.04015016 0.117820915 -0.038161806
           NA
## [20,]
               0.126030627 0.55059971 -0.194149489
                                                    0.468270787
               0.014259469
                           0.27345810 -0.060769327
                                                    0.242655910
## [21,]
           NA
## [22,]
               0.119689908 0.10167636 0.012980060 - 0.070651217
           NA
## [23,]
           NA -0.017783871 -0.18388223 -0.087000855 -0.174800246
## [24,]
           NA
               0.190014778 0.42745234 -0.057583166 0.095589128
               0.271364010
                            0.39676504 -0.023819978 0.147716399
## [25,]
           NA
## [26,]
                        NA
                                   NA
                                                NA
                                                             NΑ
           NA
## [27,]
           NA
               0.154870740
                            0.60067072 -0.185757511
                                                    0.537850092
## [28,]
               0.180402755
                            0.56202176 -0.151521371
                                                    0.478953820
           NA
                            0.23892339 -0.0033333699 0.224880142
## [29,]
           NA
               0.171697687
## [30,]
           NA
               0.084773809 0.30881882 -0.032588814
                                                    0.188685840
## [31,]
           NA -0.018339734 -0.11393686 0.070356184 -0.387267783
               0.020422830 0.03037057 0.025503660
                                                    0.031354513
## [32,]
           NΑ
## [33,]
               0.043160378 0.06488636 0.054810529 -0.050364435
           NA
```

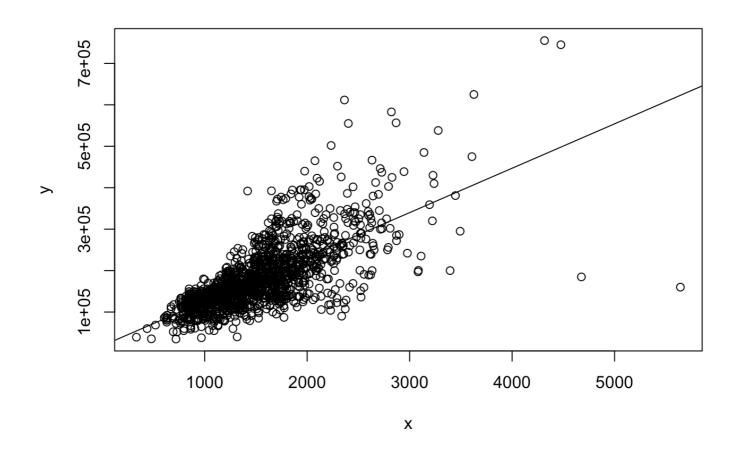
```
## [34,]
           NA 0.077672392 0.06516584 -0.001984942 0.004949728
           NA 0.038067692 -0.03140621 0.068776806 -0.034383139
## [35,]
## [36,]
           NA 0.001204988 0.07081517 -0.003510839 0.012398471
## [37,]
           NA -0.014261407 -0.02734671 0.043949746 -0.013617680
           NA 0.263843354 0.79098160 -0.077855894 0.522897333
## [38,]
           NA -0.033225519 -0.02836475 0.012608925 -0.012712715
## [39,]
           NA -0.139781082 0.03262771 -0.059315817 0.027850137
## [40,]
## [41,]
            1
                                    NA
           NA 1.000000000 0.10580574 -0.005636270 0.014227652
## [42,]
## [43,]
           NA 0.105805742 1.00000000 -0.091932343 0.572322769
## [44,]
           NA -0.005636270 -0.09193234 1.000000000 -0.375983196
           NA 0.014227652 0.57232277 -0.375983196 1.000000000
## [45,]
```

```
cor_with_SalePrice <- cor_value[38,]
cor_with_SalePrice</pre>
```

```
NA 0.26384335 0.79098160
## [1] -0.02191672 -0.08428414
## [6] -0.07785589 0.52289733 0.50710097
                                        NA
                                           0.38641981
0.31933380
0.56066376
## [21] 0.28410768 0.16821315 -0.13590737 0.53372316 0.46692884
## [26]
            NA 0.64040920 0.62343144 0.32441344 0.31585623
## [31] -0.12857796 0.04458367 0.11144657 0.09240355 -0.02118958
## [36] 0.04643225 -0.02892259 1.00000000 -0.02191672 -0.08428414
             NA 0.26384335 0.79098160 -0.07785589 0.52289733
## [41]
```

```
## Based on correlation coeffcient, LotArea is the most correlated with SalePrice,
GrLivArea comes the second

## 1.4
x <- ameslist$GrLivArea
y <- ameslist$SalePrice
z <- lm(y ~ x)
plot(x,y)
abline(z)</pre>
```



scatterplot(x,y)
outliner <- which(ameslist\$GrLivArea>4000)
outliner

[1] 524 692 1183 1299

```
## 2.1
options(na.action='na.pass')
GarageTemp = model.matrix( ~ ameslist$GarageType - 1, data=ameslist$GarageType)
ameslist <- cbind(ameslist, GarageTemp)
ameslist$GarageOutside <- ifelse(ameslist$'ameslist$GarageTypeDetchd' == 1 | amesl
ist$'ameslist$GarageTypeCarPort' == 1, 1, 0)

x <- ameslist$GarageOutside
y <- ameslist$SalePrice
not_na_position <- which(!is.na(x))
x <- x[not_na_position]
y <- y[not_na_position]
lm.fit=lm(y ~ x)

## 2.2
names(Ames)</pre>
```

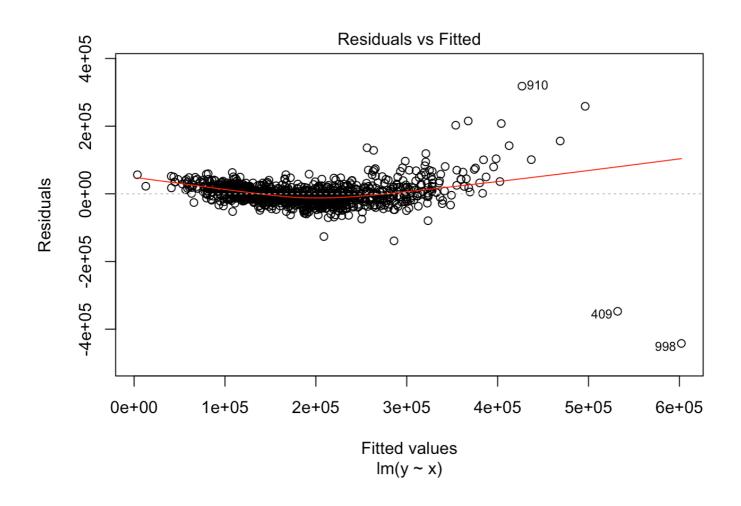
```
##
    [1] "Id"
                         "MSSubClass"
                                          "LotFrontage"
                                                           "LotArea"
##
                         "OverallCond"
                                          "YearBuilt"
                                                           "YearRemodAdd"
    [5] "OverallQual"
## [9] "MasVnrArea"
                         "BsmtFinSF1"
                                          "BsmtFinSF2"
                                                           "BsmtUnfSF"
                                                           "LowOualFinSF"
                         "X1stFlrSF"
                                          "X2ndFlrSF"
## [13] "TotalBsmtSF"
                         "BsmtFullBath"
                                          "BsmtHalfBath"
                                                           "FullBath"
## [17] "GrLivArea"
## [21] "HalfBath"
                         "BedroomAbvGr"
                                          "KitchenAbvGr"
                                                           "TotRmsAbvGrd"
## [25] "Fireplaces"
                         "GarageYrBlt"
                                          "GarageCars"
                                                           "GarageArea"
## [29] "WoodDeckSF"
                         "OpenPorchSF"
                                          "EnclosedPorch" "X3SsnPorch"
## [33] "ScreenPorch"
                         "PoolArea"
                                          "MiscVal"
                                                           "MoSold"
## [37] "YrSold"
                         "SalePrice"
```

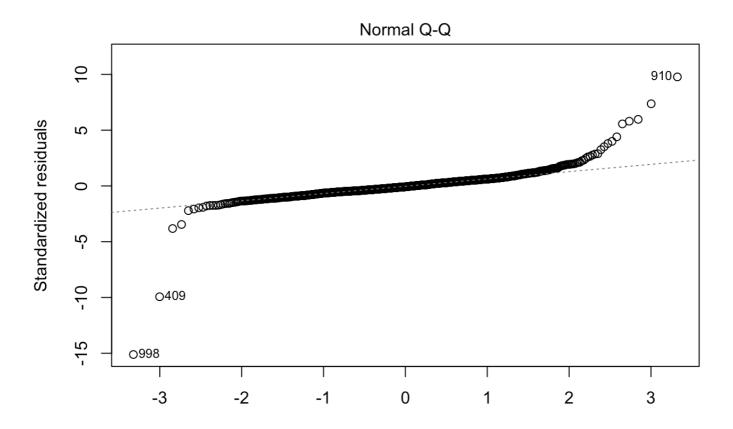
```
Ames_matrix <- na.exclude(Ames_matrix)
y <- Ames_matrix[,38]
x <- Ames_matrix[,c(1:37,39:45)]
lm.fit=lm(y ~ x)
summary(lm.fit)</pre>
```

```
##
## Call:
## lm(formula = y \sim x)
##
## Residuals:
##
       Min
               10 Median
                                30
                                       Max
## -442182 -16955
                     -2824
                             15125 318183
##
## Coefficients: (9 not defined because of singularities)
                 Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) -3.351e+05 1.701e+06 -0.197 0.843909
## x1
               -1.205e+00 2.658e+00 -0.453 0.650332
## x2
               -2.001e+02 3.451e+01 -5.797 8.84e-09 ***
## x3
               -1.160e+02 6.126e+01 -1.894 0.058503 .
```

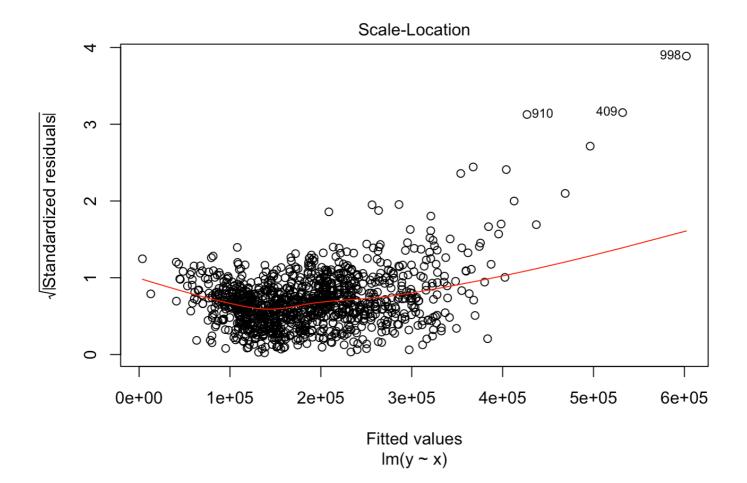
```
5.422e-01
                           1.575e-01
                                        3.442 0.000599 ***
## x4
                1.866e+04 1.482e+03 12.592 < 2e-16 ***
## x5
## x6
                5.239e+03
                           1.368e+03
                                        3.830 0.000135 ***
                                        3.610 0.000321 ***
## x7
                3.164e+02
                           8.766e+01
                                        1.378 0.168607
## x8
                1.194e+02
                           8.668e+01
## x9
                                        4.473 8.54e-06 ***
                3.141e+01
                           7.022e+00
                1.736e+01
                           5.838e+00
                                        2.973 0.003014 **
## x10
## x11
                8.342e+00
                           8.766e+00
                                        0.952 0.341532
## x12
                5.005e+00
                            5.277e+00
                                        0.948 0.343173
## x13
                                   NA
                                           NA
                                                    NA
                       NA
## x14
                4.597e+01
                           7.360e+00
                                        6.246 6.02e-10 ***
## x15
                                        7.641 4.72e-14 ***
                4.663e+01
                           6.102e+00
                           2.794e+01
                                        1.196 0.232009
## x16
                3.341e+01
## x17
                                  NA
                                           NA
                       NΑ
                                                    NΑ
## x18
                9.043e+03
                            3.198e+03
                                        2.828 0.004776 **
## x19
                2.465e+03
                           5.073e+03
                                        0.486 0.627135
## x20
                5.433e+03
                           3.531e+03
                                        1.539 0.124182
## x21
               -1.098e+03
                           3.321e+03 -0.331 0.740945
                                      -4.742 2.40e-06 ***
## x22
               -1.022e+04
                           2.155e+03
## x23
               -2.202e+04
                           6.710e+03 -3.282 0.001063 **
## x24
                           1.487e+03
                                      3.674 0.000251 ***
                5.464e+03
                                        1.998 0.046020 *
## x25
                4.372e+03
                           2.189e+03
## x26
               -4.728e+01
                           9.106e+01 -0.519 0.603742
## x27
                1.685e+04
                           3.491e+03
                                        4.827 1.58e-06 ***
## x28
                6.274e+00
                           1.213e+01
                                        0.517 0.605002
## x29
                2.144e+01
                           1.002e+01
                                        2.139 0.032662 *
                           1.949e+01 -0.116 0.907998
## x30
               -2.252e+00
## x31
                7.295e+00
                           2.062e+01
                                        0.354 0.723590
## x32
                           3.758e+01
                                        0.891 0.373163
                3.349e+01
## x33
                5.805e+01
                           2.041e+01
                                        2.844 0.004532 **
## x34
               -6.052e+01
                           2.990e+01
                                       -2.024 0.043204 *
                           6.960e+00 -0.540 0.589016
## x35
               -3.761e+00
## x36
               -2.217e+02
                           4.229e+02
                                      -0.524 0.600188
               -2.474e+02
                                      -0.293 0.769917
## x37
                           8.458e+02
## x38
                                   NA
                                           NΑ
                                                    NΑ
                       NA
## x39
                                   NA
                                           NA
                                                    NA
                       NΑ
## x40
                       NA
                                   NA
                                           NA
                                                    NA
## x41
                                   NA
                       NA
                                           NA
                                                    NA
## x42
                       NA
                                   NA
                                           NA
                                                    NA
## x43
                                   NA
                                           NA
                                                    NA
                       NΑ
## x44
                       NA
                                   NA
                                           NA
                                                    NA
## ---
                   0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
##
## Residual standard error: 36800 on 1085 degrees of freedom
## Multiple R-squared: 0.8096, Adjusted R-squared: 0.8034
## F-statistic: 131.8 on 35 and 1085 DF, p-value: < 2.2e-16
```

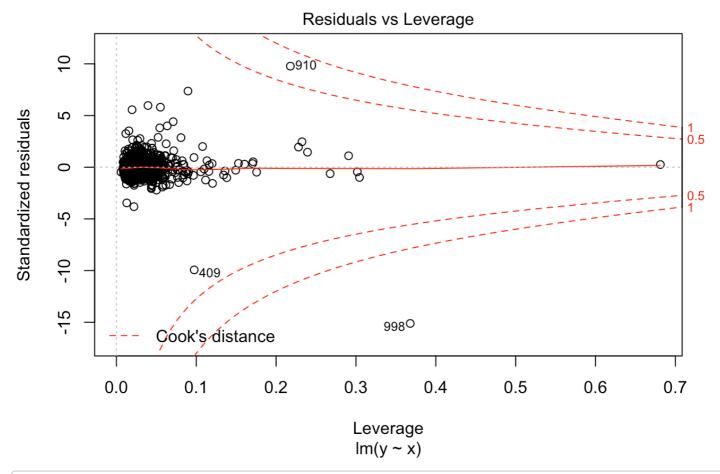
```
## Yes
## x2, x4, x5, x6, x9, x14, x15, x22, x24, x27
## MSSubClass, LotArea, OverallQual, OverallCond, MasVnrArea, X1stFlrSF, X2ndFlrSF
, BedroomAbvGr
## TotRmsAbvGrd, GarageCars
## 2.3
plot(lm.fit)
```





Theoretical Quantiles $Im(y \sim x)$





```
## There are three outliers points in the plot

## 2.4

y <- Ames_matrix[,38]

x1 <- Ames_matrix[,4]

x2 <- Ames_matrix[,17]

lm.fit=lm(y ~ x1 * x2)

summary(lm.fit)</pre>
```

```
##
## Call:
## lm(formula = y \sim x1 * x2)
##
## Residuals:
##
      Min
               10 Median
                                3Q
                                      Max
## -233473 -29836
                   -1886
                            23925 327091
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) -3.918e+04 8.119e+03 -4.825 1.59e-06 ***
## x1
               5.098e+00 5.496e-01 9.276 < 2e-16 ***
               1.352e+02 4.803e+00 28.157 < 2e-16 ***
## x2
              -2.023e-03 2.452e-04 -8.251 4.39e-16 ***
## x1:x2
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 56770 on 1117 degrees of freedom
## Multiple R-squared: 0.5334, Adjusted R-squared: 0.5321
## F-statistic: 425.6 on 3 and 1117 DF, p-value: < 2.2e-16
```

```
## SalePrice ~ LotArea * GrLivArea, statistically Significant

## 2.5
## x^2
y <- Ames_matrix[,38]
x <- Ames_matrix[,c(1:37,39:45)]
trans_x <- x^2
x <- cbind(x, trans_x)
lm.fit=lm(y ~ x)
summary(lm.fit)</pre>
```

```
##
## Call:
## lm(formula = y \sim x)
##
## Residuals:
##
      Min
               1Q Median
                               3Q
                                      Max
## -309034 -13037 -398
                            11802 176345
##
## Coefficients: (16 not defined because of singularities)
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) 6.423e+08 2.273e+09
                                      0.283 0.777554
## x1
               1.945e+01 8.273e+00 2.351 0.018926 *
               6.539e+01 9.273e+01 0.705 0.480858
## x2
               7.266e+01 1.162e+02 0.625 0.532046
## x3
               1.023e+00 2.782e-01 3.677 0.000248 ***
## x4
              -4.747e+04 5.498e+03 -8.634 < 2e-16 ***
## x5
```

```
1.968e+04
                             6.444e+03
                                          3.054 0.002314 **
## x6
## x7
                 4.692e+03
                             6.894e+03
                                          0.681 0.496321
## x8
                -4.325e+04
                             1.572e+04
                                         -2.751 0.006036 **
## x9
                -1.206e+01
                             1.073e+01
                                         -1.124 0.261416
                             8.079e+00
                                          7.356 3.83e-13 ***
## x10
                 5.942e+01
## x11
                 1.633e+01
                             1.711e+01
                                          0.954 0.340239
## x12
                 1.268e+01
                             9.201e+00
                                          1.378 0.168430
## x13
                                             NA
                         NA
## x14
                 1.264e+02
                             1.795e+01
                                          7.043 3.40e-12 ***
## x15
                 4.032e+01
                             1.192e+01
                                          3.384 0.000741 ***
## x16
                 7.456e+00
                             9.595e+01
                                          0.078 0.938075
## x17
                         NA
                                     NΑ
                                             NA
                                                       NΑ
## x18
                 8.658e+02
                             7.114e+03
                                          0.122 0.903154
## x19
                 1.382e+04
                             1.777e+04
                                          0.778 0.436978
## x20
                -2.817e+04
                             1.158e+04
                                         -2.432 0.015177 *
## x21
                 2.373e+04
                             7.946e+03
                                          2.986 0.002892 **
## x22
                 8.428e+03
                             6.219e+03
                                          1.355 0.175644
## x23
                 2.292e+04
                             4.939e+04
                                          0.464 0.642718
## x24
                -1.345e+04
                             4.721e+03
                                         -2.848 0.004481 **
## x25
                -1.869e+03
                             3.670e+03
                                         -0.509 0.610796
                             8.984e+03
## x26
                -2.525e+04
                                         -2.810 0.005040 **
## x27
                                         -3.140 0.001735 **
                -2.982e+04
                             9.494e+03
## x28
                -1.108e+00
                             3.198e+01
                                         -0.035 0.972365
## x29
                 1.216e+01
                             1.618e+01
                                          0.752 0.452321
## x30
                 1.169e+02
                             3.139e+01
                                          3.724 0.000207 ***
## x31
                 7.718e+01
                             3.983e+01
                                          1.938 0.052925
## x32
                 1.319e+02
                             7.708e+01
                                          1.712 0.087226
## x33
                 9.661e+00
                             4.499e+01
                                          0.215 0.830019
## x34
                -3.794e+02
                                         -1.226 0.220293
                             3.093e+02
## x35
                -4.751e+00
                             1.410e+01
                                         -0.337 0.736274
##
  x36
                 1.482e+03
                             1.327e+03
                                          1.117 0.264219
                -5.777e+05
                             2.264e+06
                                         -0.255 0.798615
##
  x37
## x38
                                     NΑ
                                             NΑ
                                                       NΑ
                         NΑ
## x39
                                     NA
                         NA
                                             NΑ
                                                       NA
## x40
                                     NA
                                                       NA
                         NA
                                             NA
## x41
                                     NA
                                             NA
                                                       NA
                         NA
## x42
                         NA
                                     NA
                                             NA
                                                       NA
## x43
                         NA
                                     NA
                                             NΑ
                                                       NΑ
## x44
                         NA
                                     NA
                                             NA
                                                       NΑ
## x45
                -1.307e-02
                             5.479e-03
                                         -2.386 0.017229
                -4.580e-01
                                         -0.951 0.342042
## x46
                             4.818e-01
## x47
                             5.256e-01
                                         -0.393 0.694200
                -2.067e-01
## x48
                -1.798e-06
                             1.435e-06
                                         -1.252 0.210674
## x49
                 4.991e+03
                             4.312e+02
                                         11.574
                                                 < 2e-16 ***
## x50
                -9.899e+02
                             5.480e+02
                                         -1.806 0.071176
                             1.771e+00
                                         -0.630 0.528989
## x51
                -1.115e+00
## x52
                 1.095e+01
                             3.975e+00
                                          2.755 0.005978 **
## x53
                 3.548e-02
                             1.178e-02
                                          3.013 0.002649 **
## x54
                -9.608e-03
                             3.828e-03
                                         -2.510 0.012231 *
## x55
                 2.103e-02
                             1.677e-02
                                          1.254 0.210039
```

```
## x56
                6.121e-03 4.045e-03
                                       1.513 0.130517
## x57
               -3.862e-03 3.958e-03 -0.976 0.329476
## x58
               -1.220e-02
                          7.200e-03 -1.695 0.090401 .
## x59
                4.541e-02 8.933e-03 5.083 4.40e-07 ***
## x60
                1.190e-01 2.234e-01
                                       0.533 0.594269
               -1.150e-02 3.405e-03 -3.378 0.000758 ***
## x61
## x62
               -2.295e+03 6.184e+03 -0.371 0.710695
                           1.651e+04 -0.720 0.471840
## x63
               -1.188e+04
## x64
                9.743e+03
                           3.439e+03
                                     2.833 0.004697 **
## x65
               -1.520e+04
                           6.757e+03 -2.249 0.024696 *
## x66
               -2.529e+03
                           1.047e+03 -2.416 0.015852 *
## x67
                           1.578e+04 -0.930 0.352445
               -1.468e+04
## x68
                           3.215e+02
                                      3.476 0.000530 ***
                1.117e+03
                                       2.351 0.018915 *
## x69
                4.658e+03
                          1.982e+03
                           2.293e+00
                                       2.813 0.005007 **
## x70
                6.450e+00
## x71
                9.433e+03 2.225e+03
                                       4.239 2.44e-05 ***
## x72
                5.588e-03
                           2.406e-02
                                       0.232 0.816365
## x73
               -1.820e-02 3.645e-02 -0.499 0.617650
## x74
               -5.088e-01 1.093e-01 -4.653 3.69e-06 ***
## x75
               -2.909e-01 1.567e-01 -1.856 0.063716 .
## x76
               -2.200e-01 2.153e-01 -1.022 0.307033
## x77
                                      0.913 0.361573
                1.539e-01 1.686e-01
## x78
                7.129e-01 5.263e-01
                                     1.355 0.175828
## x79
               -1.000e-03
                           7.830e-03
                                     -0.128 0.898364
## x80
               -1.362e+02
                           9.804e+01 -1.389 0.165204
## x81
                1.439e+02
                           5.637e+02
                                       0.255 0.798536
## x82
                                  NΑ
                                          NΑ
                                                   NΑ
                       NΑ
                                  NA
## x83
                       NA
                                          NA
                                                   NA
## x84
                                  NA
                                                   NA
                       NA
                                          NA
## x85
                       NA
                                  NA
                                          NA
                                                   NA
## x86
                       NΑ
                                  NA
                                          NΑ
                                                   NA
## x87
                       NA
                                  NA
                                          NA
                                                   NA
## x88
                                  NA
                       NA
                                          NΑ
                                                   NΑ
## ---
                   0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
##
## Residual standard error: 28350 on 1048 degrees of freedom
## Multiple R-squared: 0.8908, Adjusted R-squared: 0.8833
## F-statistic: 118.8 on 72 and 1048 DF, p-value: < 2.2e-16
```

```
## sqrt(x)
y <- Ames_matrix[,38]
x <- Ames_matrix[,c(1:37,39:45)]
trans_x <- sqrt(x)
x <- cbind(x, trans_x)
lm.fit=lm(y ~ x)
summary(lm.fit)</pre>
```

##

```
## Call:
## lm(formula = y \sim x)
##
## Residuals:
##
       Min
                     Median
                                  30
                 1Q
                                         Max
##
   -343428
             -14075
                       -397
                               12190
                                      249513
##
  Coefficients: (17 not defined because of singularities)
##
##
                  Estimate Std. Error t value Pr(>|t|)
                 1.775e+08
                            6.095e+07
                                         2.912 0.003664 **
## (Intercept)
## x1
                -2.519e+01
                             1.115e+01
                                       -2.258 0.024130 *
## x2
                 6.808e+01
                            1.708e+02
                                         0.399 0.690335
                            2.735e+02
                                       -1.873 0.061354
## x3
                -5.122e+02
## x4
                 3.430e-01
                            3.221e-01
                                         1.065 0.287035
## x5
                 1.220e+05
                            1.129e+04
                                        10.801 < 2e-16 ***
## x6
                -1.376e+04
                            1.229e+04
                                        -1.120 0.263107
## x7
                -1.888e+04
                            1.503e+04
                                        -1.256 0.209455
## x8
                 6.518e+04
                            3.410e+04
                                         1.911 0.056220 .
## x9
                 7.659e+01
                            1.487e+01
                                         5.152 3.09e-07 ***
                 1.508e+01
                                         1.034 0.301216
## x10
                            1.458e+01
## x11
                 3.608e+01
                            2.554e+01
                                         1.413 0.158014
## x12
                 1.244e+01
                             1.509e+01
                                         0.825 0.409827
## x13
                        NA
                                    NA
                                            NA
                                                      ΝA
## x14
                -1.348e+02
                            3.518e+01
                                        -3.831 0.000135 ***
## x15
                 3.530e+01
                            2.246e+01
                                         1.571 0.116419
## x16
                 1.164e+01
                             1.220e+02
                                         0.095 0.924012
## x17
                        NΑ
                                    NΑ
                                            NΑ
                                                      NΑ
                                        -2.149 0.031871 *
## x18
                -5.122e+04
                            2.384e+04
## x19
                -8.758e+04
                             6.596e+04
                                        -1.328 0.184515
## x20
                 4.449e+04
                            1.373e+04
                                         3.240 0.001233 **
## x21
                -5.181e+04
                            2.478e+04
                                        -2.091 0.036803 *
## x22
                -1.083e+04
                            7.831e+03
                                        -1.383 0.167059
## x23
                -5.257e+04
                            1.456e+05
                                        -0.361 0.718047
## x24
                 3.158e+04
                            9.667e+03
                                         3.267 0.001122 **
## x25
                 2.165e+04
                            6.916e+03
                                         3.130 0.001795 **
                                         2.264 0.023770 *
## x26
                 4.444e+04
                             1.963e+04
## x27
                 1.332e+05
                            2.044e+04
                                         6.515 1.13e-10 ***
## x28
                            5.997e+01
                                        -0.733 0.463831
                -4.395e+01
                            2.650e+01
## x29
                 3.471e+00
                                         0.131 0.895816
## x30
                -9.402e+01
                             4.237e+01
                                        -2.219 0.026723 *
## x31
                -3.859e+01
                            7.453e+01
                                        -0.518 0.604757
## x32
                -9.130e+01
                            1.348e+02
                                        -0.677 0.498474
## x33
                 9.711e+01
                             8.572e+01
                                         1.133 0.257484
## x34
                 3.070e+03
                             5.852e+02
                                         5.247 1.87e-07 ***
## x35
                 1.331e+01
                            1.909e+01
                                         0.697 0.485928
## x36
                -3.860e+03
                            2.148e+03
                                        -1.797 0.072616 .
## x37
                 1.335e+02
                             7.191e+02
                                         0.186 0.852751
## x38
                                    NA
                                            NA
                        NA
                                                      NΑ
## x39
                        NA
                                    NA
                                            NA
                                                      NΑ
## x40
                        NA
                                    NA
                                             NA
                                                      NA
```

```
## x41
                         NΑ
                                     NA
                                             NA
                                                       NA
## x42
                         NΑ
                                     NA
                                             NΑ
                                                       NΑ
## x43
                                     NA
                                             NA
                                                       NA
                         NA
## x44
                                     NA
                                             NA
                         NA
                                                       NA
## x45
                 1.156e+03
                             5.208e+02
                                          2.220 0.026639 *
## x46
                -1.136e+03
                             2.832e+03
                                         -0.401 0.688364
##
   x47
                 9.103e+03
                             5.023e+03
                                          1.812 0.070206
##
   x48
                                          1.442 0.149593
                 1.751e+02
                             1.214e+02
## x49
                -5.181e+05
                             5.475e+04
                                         -9.464
                                                 < 2e-16 ***
## x50
                 1.024e+05
                             5.761e+04
                                          1.777 0.075869
## x51
                 1.697e+06
                             1.326e+06
                                          1.280 0.201003
## x52
                -5.790e+06
                             3.032e+06
                                         -1.909 0.056479.
   x53
                                         -4.229 2.55e-05 ***
##
                -1.447e+03
                             3.421e+02
##
   x54
                 5.189e+02
                             2.951e+02
                                          1.758 0.079019 .
## x55
                -5.424e+02
                             5.519e+02
                                         -0.983 0.325921
## x56
                -1.951e+02
                             3.645e+02
                                         -0.535 0.592508
## x57
                 8.608e+01
                             6.242e+02
                                          0.138 0.890341
## x58
                 8.843e+03
                             2.418e+03
                                          3.658 0.000267 ***
## x59
                -1.641e+03
                             5.257e+02
                                         -3.122 0.001847 **
                                         -0.365 0.715519
## x60
                -8.657e+02
                             2.375e+03
##
   x61
                 4.653e+03
                             2.229e+03
                                          2.088 0.037080 *
## x62
                 5.401e+04
                             2.405e+04
                                          2.246 0.024906 *
                             6.659e+04
## x63
                 9.281e+04
                                          1.394 0.163721
## x64
                -8.978e+04
                             3.294e+04
                                         -2.725 0.006531 **
## x65
                 6.055e+04
                             2.538e+04
                                          2.386 0.017230 *
## x66
                 1.350e+04
                             2.408e+04
                                          0.561 0.575180
                 5.960e+04
## x67
                             3.558e+05
                                          0.168 0.866998
                                         -2.953 0.003222 **
## x68
                -1.478e+05
                             5.005e+04
## x69
                -2.038e+04
                             8.047e+03
                                         -2.533 0.011461 *
## x70
                -3.929e+06
                             1.737e+06
                                         -2.261 0.023940 *
## x71
                -3.311e+05
                             5.549e+04
                                         -5.968 3.29e-09 ***
## x72
                 2.022e+03
                             2.849e+03
                                          0.710 0.478013
                             4.579e+02
                                          0.080 0.935902
## x73
                 3.683e+01
## x74
                 1.289e+03
                             5.989e+02
                                          2.153 0.031541 *
   x75
                 8.919e+02
                             1.056e+03
                                          0.845 0.398303
##
## x76
                 2.482e+03
                             2.217e+03
                                          1.119 0.263240
## x77
                -7.072e+02
                             1.269e+03
                                         -0.557 0.577448
                             1.401e+04
                                         -5.222 2.14e-07 ***
## x78
                -7.314e+04
                             6.536e+02
## x79
                -6.332e+02
                                         -0.969 0.332869
## x80
                 1.714e+04
                             1.008e+04
                                          1.701 0.089148
## x81
                                     NA
                                             NA
                                                       NA
                         NA
                                     NA
## x82
                         NΑ
                                             NΑ
                                                       NA
## x83
                         NA
                                     NA
                                              NA
                                                       NA
## x84
                         NA
                                     NA
                                             NA
                                                       NA
## x85
                                     NA
                         NA
                                             NA
                                                       NA
## x86
                         NA
                                     NA
                                             NA
                                                       NA
## x87
                                     NA
                                                       NA
                         NA
                                             NA
## x88
                         NA
                                     NA
                                             NA
                                                       NA
##
                     0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
```

```
##
## Residual standard error: 30770 on 1049 degrees of freedom
## Multiple R-squared: 0.8713, Adjusted R-squared: 0.8625
## F-statistic: 99.98 on 71 and 1049 DF, p-value: < 2.2e-16</pre>
```

```
## ln(x)
## OverallQual as example
y <- Ames_matrix[,38]
x <- Ames_matrix[,5]
trans_x <- log(x)
x <- cbind(x, trans_x)
lm.fit=lm(y ~ x)
summary(lm.fit)</pre>
```

```
##
## Call:
## lm(formula = y \sim x)
##
## Residuals:
      Min
              1Q Median
##
                               3Q
                                      Max
## -262887 -25783 -196
                            20217 332113
##
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
               257084
                            30159
                                  8.524
                                            <2e-16 ***
## (Intercept)
## xx
                             6228 20.076
                                            <2e-16 ***
                125034
## xtrans x
               -471007
                            37551 -12.543
                                          <2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 46890 on 1118 degrees of freedom
## Multiple R-squared: 0.6814, Adjusted R-squared: 0.6809
## F-statistic: 1196 on 2 and 1118 DF, p-value: < 2.2e-16
```