Uber Polynomial Regression Analysis

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```
suppressWarnings(suppressPackageStartupMessages({
library(plm)
}))
## Load data file
vs <- read.csv("Vehicle_Sales.csv", header = T)</pre>
attach(vs)
head(vs)
##
     city_id year_month year month totreg_nonbusiness monthid
                                                                   lnSales
## 1
          49
                 201001 2010
                                                  21934
                                                               1 9.995839
                                  1
## 2
          49
                 201002 2010
                                                  18646
                                                               2 9.833441
## 3
          49
                 201003 2010
                                  3
                                                  22723
                                                               3 10.031177
## 4
          49
                 201004 2010
                                                               4 10.390717
                                                  32555
## 5
          49
                 201005 2010
                                  5
                                                  24491
                                                               5 10.106102
## 6
          49
                 201006 2010
                                  6
                                                  17798
                                                               6 9.786898
##
     Indidi lnuber lnyidao lnshenzhou Uber platform soft ln populationcity
## 1
          0
                NA
                          0
                                     0
                                           0
                                                          0
                                                                     7.039336
## 2
          0
                NA
                          0
                                     0
                                           0
                                                          0
                                                                     7.039336
## 3
          0
                NΑ
                          0
                                     0
                                           0
                                                          0
                                                                     7.039336
                NA
                                     0
## 4
          0
                          0
                                           0
                                                          0
                                                                     7.039336
## 5
          0
                NA
                          0
                                     0
                                           0
                                                                     7.039336
                          0
                                     0
## 6
                NA
                                           0
                                                                     7.039336
##
     ln_populationdensitycity ln_employedcity ln_unemployedcity
                      6.847167
                                      5.109636
## 2
                                                          11.11842
                      6.847167
                                       5.109636
## 3
                      6.847167
                                      5.109636
                                                          11.11842
## 4
                                      5.109636
                                                          11.11842
                      6.847167
## 5
                      6.847167
                                       5.109636
                                                          11.11842
## 6
                                                          11.11842
                      6.847167
                                       5.109636
     ln_wageofstaffandworkercity ln_highwaypassengertraffic
## 1
                         10.43987
                                                     11.40841
## 2
                         10.43987
                                                     11.40841
## 3
                         10.43987
                                                     11.40841
## 4
                         10.43987
                                                     11.40841
## 5
                         10.43987
                                                     11.40841
## 6
                         10.43987
                                                     11.40841
     ln_aviationpassengertraffic ln_grpcity ln_grppercapitacity
## 1
                         7.023581
                                    17.62275
                                                          10.46926
## 2
                         7.023581
                                    17.62275
                                                          10.46926
## 3
                         7.023581
                                   17.62275
                                                          10.46926
## 4
                         7.023581
                                   17.62275
                                                          10.46926
                         7.023581
                                    17.62275
## 5
                                                          10.46926
## 6
                         7.023581
                                    17.62275
                                                          10.46926
     ln_mobilesubscriberscity ln_internetsubscriberscity ln_roadarea ln_buses
                      7.279319
                                                  4.820282
                                                               8.746716
## 1
## 2
                      7.279319
                                                  4.820282
                                                               8.746716
                                                                          8.9297
```

```
## 3
                    7.279319
                                              4.820282
                                                          8.746716
                                                                     8.9297
                                              4.820282
## 4
                    7.279319
                                                          8.746716 8.9297
## 5
                    7.279319
                                              4.820282
                                                          8.746716 8.9297
## 6
                    7.279319
                                              4.820282
                                                          8.746716 8.9297
##
    ln_buspassengervolume ln_taxis ln_busesper1000 ln_roadareapercapita
## 1
                 11.6941 9.545383 2.74084
                                                              2.570319
## 2
                 11.6941 9.545383
                                         2.74084
                                                              2.570319
## 3
                  11.6941 9.545383
                                         2.74084
                                                              2.570319
                                          2.74084
## 4
                  11.6941 9.545383
                                                              2.570319
## 5
                  11.6941 9.545383
                                          2.74084
                                                              2.570319
## 6
                  11.6941 9.545383
                                          2.74084
                                                              2.570319
##
    ln_metro_length ln_gas90
## 1
                  0 1.943049
## 2
                  0 1.943049
## 3
                  0 1.943049
## 4
                  0 1.964311
## 5
                  0 1.800058
## 6
                  0 1.788421
#log dependent variables logs as percentage change, rather than just values
reg1 <- lm(lnSales ~ Uber)
summary(reg1)
##
## Call:
## lm(formula = lnSales ~ Uber)
## Residuals:
                    Median
                 1Q
                                   3Q
       Min
## -1.63397 -0.35652 0.00911 0.34944 1.61053
##
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 9.37333 0.01671 561.06 <2e-16 ***
              0.61000
                          0.05358 11.38 <2e-16 ***
## Uber
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.504 on 1006 degrees of freedom
## Multiple R-squared: 0.1141, Adjusted R-squared: 0.1133
## F-statistic: 129.6 on 1 and 1006 DF, p-value: < 2.2e-16
## we see there's a relationship, but it's just not plausible
## as time increases, Uber increases. As time increases, vehicles sales change
## (don't know if it's up or down)
reg2 <- lm(lnSales ~ Uber + monthid)
summary(reg2)
##
## Call:
## lm(formula = lnSales ~ Uber + monthid)
```

```
##
## Residuals:
##
       Min
                  1Q
                      Median
## -1.44612 -0.29364 0.01177 0.31981 1.37544
##
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 9.0477690 0.0314775 287.436 < 2e-16 ***
## Uber
               0.2659055 0.0578893
                                     4.593 4.92e-06 ***
## monthid
              0.0098361 0.0008252 11.919 < 2e-16 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.472 on 1005 degrees of freedom
## Multiple R-squared: 0.2239, Adjusted R-squared: 0.2223
## F-statistic: 144.9 on 2 and 1005 DF, p-value: < 2.2e-16
#however, month should not be treated as an interval number. Let's factor it
reg3 <- lm(lnSales ~ Uber + as.factor(monthid))</pre>
summary(reg3)
##
## Call:
## lm(formula = lnSales ~ Uber + as.factor(monthid))
##
## Residuals:
##
       Min
                1Q Median
                                3Q
                                       Max
## -1.4285 -0.2515 -0.0071 0.2663
                                  1.2683
##
## Coefficients:
                         Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                         9.174604
                                    0.115690 79.304 < 2e-16 ***
## Uber
                         0.727651
                                    0.084202
                                               8.642 < 2e-16 ***
## as.factor(monthid)2 -0.466171
                                             -2.849 0.004478 **
                                    0.163610
## as.factor(monthid)3
                       -0.191012
                                    0.163610
                                              -1.167 0.243312
## as.factor(monthid)4 -0.052159
                                    0.163610
                                             -0.319 0.749949
## as.factor(monthid)5
                       -0.132683
                                    0.163610
                                             -0.811 0.417589
## as.factor(monthid)6
                       -0.190413
                                    0.163610
                                             -1.164 0.244793
## as.factor(monthid)7
                       -0.133859
                                    0.163610
                                             -0.818 0.413473
## as.factor(monthid)8
                       -0.021723
                                    0.163610
                                             -0.133 0.894400
## as.factor(monthid)9
                         0.061801
                                    0.163610
                                              0.378 0.705713
## as.factor(monthid)10 -0.045113
                                    0.163610
                                             -0.276 0.782814
## as.factor(monthid)11
                        0.175948
                                    0.163610
                                               1.075 0.282467
## as.factor(monthid)12 0.460506
                                    0.163610
                                               2.815 0.004985 **
## as.factor(monthid)13 0.275395
                                    0.163610
                                               1.683 0.092662
## as.factor(monthid)14 -0.613474
                                    0.163610
                                              -3.750 0.000188 ***
## as.factor(monthid)15 0.058986
                                               0.361 0.718532
                                    0.163610
## as.factor(monthid)16 -0.028863
                                             -0.176 0.860008
                                    0.163610
## as.factor(monthid)17 -0.040804
                                    0.163610
                                             -0.249 0.803108
## as.factor(monthid)18 -0.081668
                                    0.163610
                                              -0.499 0.617780
## as.factor(monthid)19 -0.056989
                                    0.163610
                                             -0.348 0.727675
## as.factor(monthid)20 0.094874
                                    0.163610
                                              0.580 0.562137
## as.factor(monthid)21 0.400037
                                    0.163610
                                               2.445 0.014666 *
```

```
## as.factor(monthid)22 -0.126700
                                     0.163610
                                               -0.774 0.438886
## as.factor(monthid)23
                         0.099947
                                     0.163610
                                                0.611 0.541423
                                                1.580 0.114426
## as.factor(monthid)24
                         0.258517
                                     0.163610
## as.factor(monthid)25
                                                1.749 0.080664
                         0.286111
                                     0.163610
  as.factor(monthid)26 -0.058705
                                     0.163610
                                                -0.359 0.719819
  as.factor(monthid)27
                         0.068922
                                     0.163610
                                                0.421 0.673662
  as.factor(monthid)28 -0.028805
                                     0.163610
                                                -0.176 0.860284
                         0.139701
## as.factor(monthid)29
                                     0.163610
                                                0.854 0.393398
  as.factor(monthid)30 -0.016031
                                     0.163610
                                               -0.098 0.921968
## as.factor(monthid)31
                         0.133130
                                     0.163610
                                                0.814 0.416021
## as.factor(monthid)32
                         0.182722
                                     0.163610
                                                1.117 0.264359
## as.factor(monthid)33
                         0.377848
                                     0.163610
                                                2.309 0.021136
  as.factor(monthid)34
                         0.198531
                                     0.163610
                                                1.213 0.225268
                                                 1.916 0.055655
## as.factor(monthid)35
                         0.313495
                                     0.163610
## as.factor(monthid)36
                         0.335701
                                     0.163610
                                                2.052 0.040464 *
## as.factor(monthid)37
                         0.734878
                                     0.163610
                                                4.492 7.95e-06 ***
## as.factor(monthid)38 -0.140460
                                               -0.859 0.390832
                                     0.163610
  as.factor(monthid)39
                         0.129389
                                                0.791 0.429240
                                     0.163610
## as.factor(monthid)40
                         0.205101
                                     0.163610
                                                1.254 0.210302
## as.factor(monthid)41
                         0.298771
                                     0.163610
                                                1.826 0.068151
## as.factor(monthid)42
                         0.071582
                                     0.163610
                                                0.438 0.661836
  as.factor(monthid)43
                         0.304931
                                     0.163610
                                                1.864 0.062668 .
## as.factor(monthid)44
                         0.278476
                                     0.163610
                                                1.702 0.089075
  as.factor(monthid)45
                          0.510234
                                     0.163610
                                                3.119 0.001873 **
## as.factor(monthid)46
                         0.371851
                                     0.163610
                                                2.273 0.023265 *
## as.factor(monthid)47
                          0.466817
                                     0.163610
                                                2.853 0.004423 **
                                                3.121 0.001857 **
## as.factor(monthid)48
                         0.510632
                                     0.163610
  as.factor(monthid)49
                          0.917871
                                     0.163610
                                                5.610 2.66e-08 ***
  as.factor(monthid)50 -0.027273
                                     0.163610
                                               -0.167 0.867647
## as.factor(monthid)51
                          0.343969
                                     0.163610
                                                2.102 0.035788 *
## as.factor(monthid)52
                         0.584557
                                     0.163610
                                                3.573 0.000371 ***
  as.factor(monthid)53
                         0.574234
                                     0.163610
                                                3.510 0.000470 ***
## as.factor(monthid)54
                         0.421506
                                     0.163610
                                                2.576 0.010139 *
## as.factor(monthid)55
                         0.524941
                                     0.163610
                                                3.208 0.001380 **
   as.factor(monthid)56
                         0.368120
                                                2.250 0.024682 *
                                     0.163610
  as.factor(monthid)57
                         0.757932
                                     0.163610
                                                4.633 4.12e-06 ***
## as.factor(monthid)58
                         0.489296
                                     0.163720
                                                2.989 0.002876 **
## as.factor(monthid)59
                         0.380642
                                                2.320 0.020541 *
                                     0.164051
## as.factor(monthid)60
                         0.537143
                                                3.274 0.001098 **
                                     0.164051
                                                5.238 2.01e-07 ***
## as.factor(monthid)61
                         0.859302
                                     0.164051
  as.factor(monthid)62
                         0.412152
                                     0.164051
                                                2.512 0.012161 *
## as.factor(monthid)63
                                                1.715 0.086589
                         0.282371
                                     0.164602
  as.factor(monthid)64
                         0.402434
                                     0.164602
                                                2.445 0.014673 *
## as.factor(monthid)65
                         0.252010
                                     0.165369
                                                1.524 0.127866
## as.factor(monthid)66
                         0.067651
                                     0.168940
                                                0.400 0.688920
## as.factor(monthid)67 -0.002776
                                     0.170538
                                               -0.016 0.987016
## as.factor(monthid)68 -0.026542
                                     0.172332
                                               -0.154 0.877629
## as.factor(monthid)69
                         0.004530
                                     0.181332
                                                0.025 0.980075
                                               -0.585 0.558683
## as.factor(monthid)70 -0.107645
                                     0.184006
## as.factor(monthid)71 -0.063062
                                     0.184006
                                               -0.343 0.731889
##
  as.factor(monthid)72 0.152433
                                     0.184006
                                                0.828 0.407648
##
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
```

```
## Residual standard error: 0.4329 on 935 degrees of freedom
## Multiple R-squared: 0.3926, Adjusted R-squared: 0.3458
## F-statistic: 8.393 on 72 and 935 DF, p-value: < 2.2e-16
#doesn't take regional behavior into account
reg4 <- plm(lnSales ~ Uber + as.factor(monthid), index = c("city_id", "monthid"),</pre>
            model = "within", data = vs)
summary(reg4)
## Oneway (individual) effect Within Model
##
## Call:
## plm(formula = lnSales ~ Uber + as.factor(monthid), data = vs,
       model = "within", index = c("city_id", "monthid"))
##
## Balanced Panel: n = 14, T = 72, N = 1008
##
## Residuals:
         Min.
                   1st Qu.
                               Median
                                          3rd Qu.
                                                         Max.
## -0.89286712 -0.09451561 0.00017141 0.09252461 0.53054039
## Coefficients:
                        Estimate Std. Error t-value Pr(>|t|)
## Uber
                        0.192209
                                   0.034110 5.6349 2.327e-08 ***
## as.factor(monthid)2 -0.466171
                                   0.063066 -7.3918 3.248e-13 ***
## as.factor(monthid)3
                       -0.191012
                                   0.063066 -3.0288 0.002524 **
## as.factor(monthid)4
                       -0.052159
                                   0.063066 -0.8271 0.408420
## as.factor(monthid)5
                       -0.132683
                                   0.063066 -2.1039 0.035660 *
## as.factor(monthid)6
                       -0.190413
                                   0.063066 -3.0193 0.002604 **
                                   0.063066 -2.1225
## as.factor(monthid)7
                       -0.133859
                                                     0.034059 *
## as.factor(monthid)8
                      -0.021723
                                   0.063066 -0.3445 0.730583
## as.factor(monthid)9
                        0.061801
                                   0.063066 0.9799 0.327370
## as.factor(monthid)10 -0.045113
                                   0.063066 -0.7153
                                                     0.474588
## as.factor(monthid)11
                        0.175948
                                   0.063066 2.7899
                                                     0.005381 **
## as.factor(monthid)12 0.460506
                                   0.063066 7.3020 6.126e-13 ***
## as.factor(monthid)13 0.275395
                                   0.063066 4.3668 1.404e-05 ***
## as.factor(monthid)14 -0.613474
                                   0.063066 -9.7275 < 2.2e-16 ***
## as.factor(monthid)15 0.058986
                                   0.063066 0.9353 0.349873
## as.factor(monthid)16 -0.028863
                                   0.063066 -0.4577 0.647305
## as.factor(monthid)17 -0.040804
                                   0.063066 -0.6470 0.517790
## as.factor(monthid)18 -0.081668
                                   0.063066 -1.2950
                                                     0.195655
                                   0.063066 -0.9036 0.366420
## as.factor(monthid)19 -0.056989
## as.factor(monthid)20 0.094874
                                   0.063066 1.5044 0.132832
## as.factor(monthid)21 0.400037
                                   0.063066 6.3432 3.522e-10 ***
## as.factor(monthid)22 -0.126700
                                   0.063066 -2.0090
                                                     0.044826 *
## as.factor(monthid)23 0.099947
                                   0.063066
                                            1.5848 0.113354
## as.factor(monthid)24 0.258517
                                   0.063066
                                             4.0992 4.512e-05 ***
## as.factor(monthid)25 0.286111
                                   0.063066 4.5367 6.469e-06 ***
## as.factor(monthid)26 -0.058705
                                   0.063066 -0.9308 0.352177
## as.factor(monthid)27 0.068922
                                   0.063066 1.0929
                                                     0.274740
## as.factor(monthid)28 -0.028805
                                   0.063066 -0.4568 0.647958
## as.factor(monthid)29 0.139701
                                   0.063066 2.2152 0.026993 *
```

```
## as.factor(monthid)30 -0.016031
                                     0.063066 -0.2542
                                                       0.799405
                                                       0.035044 *
## as.factor(monthid)31
                         0.133130
                                               2.1110
                                     0.063066
                                     0.063066
## as.factor(monthid)32
                         0.182722
                                               2.8973
                                                       0.003853 **
## as.factor(monthid)33
                         0.377848
                                     0.063066
                                               5.9913 2.982e-09 ***
## as.factor(monthid)34
                         0.198531
                                     0.063066
                                               3.1480
                                                       0.001697 **
## as.factor(monthid)35
                                               4.9709 7.944e-07 ***
                         0.313495
                                     0.063066
## as.factor(monthid)36
                         0.335701
                                     0.063066
                                               5.3230 1.282e-07 ***
                                     0.063066 11.6525 < 2.2e-16 ***
## as.factor(monthid)37
                         0.734878
  as.factor(monthid)38
                        -0.140460
                                     0.063066 -2.2272
                                                       0.026175 *
## as.factor(monthid)39
                         0.129389
                                     0.063066
                                               2.0516
                                                       0.040487 *
## as.factor(monthid)40
                         0.205101
                                     0.063066
                                               3.2522 0.001187 **
## as.factor(monthid)41
                         0.298771
                                               4.7374 2.505e-06 ***
                                     0.063066
  as.factor(monthid)42
                         0.071582
                                     0.063066
                                               1.1350
                                                       0.256653
## as.factor(monthid)43
                         0.304931
                                     0.063066
                                               4.8351 1.559e-06 ***
## as.factor(monthid)44
                         0.278476
                                               4.4156 1.126e-05 ***
                                     0.063066
## as.factor(monthid)45
                         0.510234
                                     0.063066
                                               8.0905 1.865e-15 ***
                                               5.8962 5.215e-09 ***
## as.factor(monthid)46
                         0.371851
                                     0.063066
## as.factor(monthid)47
                         0.466817
                                     0.063066
                                               7.4020 3.020e-13 ***
## as.factor(monthid)48
                         0.510632
                                     0.063066
                                               8.0968 1.777e-15 ***
## as.factor(monthid)49
                         0.917871
                                     0.063066 14.5541 < 2.2e-16 ***
## as.factor(monthid)50 -0.027273
                                     0.063066 -0.4324 0.665516
## as.factor(monthid)51
                         0.343969
                                               5.4541 6.323e-08 ***
                                     0.063066
## as.factor(monthid)52
                                               9.2690 < 2.2e-16 ***
                         0.584557
                                     0.063066
## as.factor(monthid)53
                                               9.1053 < 2.2e-16 ***
                         0.574234
                                     0.063066
## as.factor(monthid)54
                         0.421506
                                     0.063066
                                               6.6836 4.032e-11 ***
## as.factor(monthid)55
                         0.524941
                                     0.063066
                                               8.3237 3.054e-16 ***
## as.factor(monthid)56
                         0.368120
                                               5.8371 7.354e-09 ***
                                     0.063066
  as.factor(monthid)57
                         0.757932
                                     0.063066 12.0181 < 2.2e-16 ***
## as.factor(monthid)58
                         0.527542
                                               8.3587 2.319e-16 ***
                                     0.063113
## as.factor(monthid)59
                         0.457133
                                     0.063254
                                               7.2270 1.035e-12 ***
## as.factor(monthid)60
                         0.613635
                                     0.063254
                                               9.7011 < 2.2e-16 ***
## as.factor(monthid)61
                         0.935794
                                     0.063254 14.7942 < 2.2e-16 ***
## as.factor(monthid)62
                         0.488644
                                     0.063254
                                               7.7251 2.910e-14 ***
                                               6.2548 6.082e-10 ***
## as.factor(monthid)63
                         0.397108
                                     0.063488
## as.factor(monthid)64
                         0.517171
                                     0.063488
                                               8.1460 1.217e-15 ***
## as.factor(monthid)65
                                               6.3464 3.452e-10 ***
                         0.404993
                                     0.063815
## as.factor(monthid)66
                         0.335372
                                     0.065331
                                               5.1334 3.471e-07 ***
## as.factor(monthid)67
                         0.303191
                                     0.066009
                                               4.5932 4.972e-06 ***
## as.factor(monthid)68
                         0.317671
                                               4.7577 2.272e-06 ***
                                     0.066769
## as.factor(monthid)69
                                               7.1093 2.336e-12 ***
                         0.501726
                                     0.070573
  as.factor(monthid)70
                         0.427797
                                     0.071700
                                               5.9665 3.452e-09 ***
## as.factor(monthid)71
                         0.472381
                                     0.071700
                                               6.5883 7.468e-11 ***
  as.factor(monthid)72
                         0.687875
                                     0.071700
                                               9.5939 < 2.2e-16 ***
##
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Total Sum of Squares:
                             125.8
## Residual Sum of Squares: 25.67
## R-Squared:
                   0.79594
## Adj. R-Squared: 0.77713
## F-statistic: 49.9495 on 72 and 922 DF, p-value: < 2.22e-16
reg5 <- plm(lnSales ~ Uber + as.factor(monthid) + lndidi + lnyidao + lnshenzhou +
              ln_highwaypassengertraffic + ln_aviationpassengertraffic +
```

```
ln_grpcity
           ln_grppercapitacity + ln_mobilesubscriberscity +
           ln_internetsubscriberscity + ln_roadarea
          + ln buses + ln buspassengervolume + ln taxis +
           ln_busesper1000 + ln_roadareapercapita
          + ln_populationcity + ln_populationdensitycity + ln_employedcity
           ln_unemployedcity + ln_wageofstaffandworkercity,
          index = c("city_id", "monthid"), model = "within", data = vs)
summary(reg5)
## Oneway (individual) effect Within Model
##
## Call:
  plm(formula = lnSales ~ Uber + as.factor(monthid) + lndidi +
     lnyidao + lnshenzhou + ln_highwaypassengertraffic + ln_aviationpassengertraffic +
##
##
     ln_grpcity + ln_grppercapitacity + ln_mobilesubscriberscity +
##
     ln_internetsubscriberscity + ln_roadarea + ln_buses + ln_buspassengervolume +
##
     ln_taxis + ln_busesper1000 + ln_roadareapercapita + ln_populationcity +
##
     ln_populationdensitycity + ln_employedcity + ln_unemployedcity +
     ln_wageofstaffandworkercity, data = vs, model = "within",
##
     index = c("city_id", "monthid"))
##
## Balanced Panel: n = 14, T = 72, N = 1008
## Residuals:
       Min.
              1st Qu.
                        Median
                                3rd Qu.
## -0.9984984 -0.0836922 -0.0015737 0.0808009 0.5897798
##
## Coefficients:
##
                           Estimate Std. Error t-value Pr(>|t|)
## Uber
                          0.0939926 0.0364247
                                             2.5805 0.0100238 *
## as.factor(monthid)2
                          ## as.factor(monthid)3
                          -0.1910119
                                    0.0591072 -3.2316 0.0012755 **
## as.factor(monthid)4
                          -0.0521589 0.0591072 -0.8824 0.3777703
## as.factor(monthid)5
                          ## as.factor(monthid)6
                          ## as.factor(monthid)7
                          -0.1338594  0.0591072  -2.2647  0.0237683 *
## as.factor(monthid)8
                          ## as.factor(monthid)9
                          0.0618012 0.0591072
                                             1.0456 0.2960356
## as.factor(monthid)10
                          ## as.factor(monthid)11
                          0.1759482 0.0591072
                                              2.9768 0.0029909 **
## as.factor(monthid)12
                                              7.7910 1.825e-14 ***
                          0.4605056 0.0591072
## as.factor(monthid)13
                          -0.0009472 0.0675748 -0.0140 0.9888194
## as.factor(monthid)14
                          -0.8898165 0.0675748 -13.1679 < 2.2e-16 ***
## as.factor(monthid)15
                          -0.2173560 0.0675748 -3.2165 0.0013437 **
## as.factor(monthid)16
                          -0.3052049 0.0675748 -4.5166 7.120e-06 ***
                          -0.3171461 0.0675748 -4.6933 3.106e-06 ***
## as.factor(monthid)17
## as.factor(monthid)18
                          ## as.factor(monthid)19
                          ## as.factor(monthid)20
                          ## as.factor(monthid)21
                                    0.1236947
## as.factor(monthid)22
```

```
## as.factor(monthid)23
                                -0.2417678
                                             0.0803180
                                                        -3.0101 0.0026841 **
## as.factor(monthid)24
                                -0.0892002
                                                        -1.0771 0.2817364
                                             0.0828174
   as.factor(monthid)25
                                                        -3.4670 0.0005512 ***
                                -0.3460613
                                             0.0998157
   as.factor(monthid)26
                                -0.6836135
                                             0.0973504
                                                        -7.0222 4.297e-12 ***
   as.factor(monthid)27
                                -0.5545310
                                             0.0968847
                                                        -5.7236 1.419e-08 ***
##
   as.factor(monthid)28
                                             0.0994605
                                                        -6.6355 5.572e-11 ***
                                -0.6599716
                                                        -4.9670 8.130e-07 ***
   as.factor(monthid)29
                                -0.4878281
                                             0.0982129
  as.factor(monthid)30
                                -0.6372464
                                             0.0961880
                                                        -6.6250 5.963e-11 ***
   as.factor(monthid)31
                                -0.4981006
                                             0.0994832
                                                        -5.0069 6.653e-07 ***
   as.factor(monthid)32
                                -0.4482706
                                             0.0993998
                                                        -4.5098 7.346e-06 ***
   as.factor(monthid)33
                                -0.2540370
                                             0.0997137
                                                        -2.5477 0.0110096 *
   as.factor(monthid)34
                                                        -4.3251 1.695e-05 ***
                                -0.4370518
                                             0.1010510
   as.factor(monthid)35
                                -0.3173041
                                             0.0993321
                                                        -3.1944 0.0014500 **
   as.factor(monthid)36
                                -0.2855007
                                             0.0961836
                                                        -2.9683 0.0030738 **
   as.factor(monthid)37
                                                        -0.7666 0.4435482
                                -0.0862482
                                             0.1125144
   as.factor(monthid)38
                                -0.9823590
                                             0.1283387
                                                        -7.6544 4.988e-14 ***
                                                        -4.4402 1.010e-05 ***
   as.factor(monthid)39
                                -0.7352458
                                             0.1655880
   as.factor(monthid)40
                                -0.6716007
                                             0.1879557
                                                        -3.5732 0.0003713 ***
   as.factor(monthid)41
                                -0.5934969
                                             0.2025980
                                                        -2.9294 0.0034814 **
   as.factor(monthid)42
                                -0.8193453
                                             0.2050173
                                                        -3.9965 6.954e-05 ***
   as.factor(monthid)43
                                -0.5887068
                                             0.2072505
                                                        -2.8406 0.0046049 **
   as.factor(monthid)44
                                             0.2089663
                                                        -2.9418 0.0033464 **
                                -0.6147408
  as.factor(monthid)45
                                             0.2083700
                                                        -1.8441 0.0654990
                                -0.3842513
   as.factor(monthid)46
                                                        -2.4967 0.0127118
                                -0.5213149
                                             0.2087991
   as.factor(monthid)47
                                -0.4256590
                                             0.2124686
                                                        -2.0034 0.0454334 *
   as.factor(monthid)48
                                -0.3916449
                                             0.2177953
                                                        -1.7982 0.0724757
  as.factor(monthid)49
                                -0.1765776
                                             0.2345414
                                                        -0.7529 0.4517285
   as.factor(monthid)50
                                -1.1223675
                                             0.2501770
                                                        -4.4863 8.183e-06
   as.factor(monthid)51
                                             0.2487029
                                                        -3.0185 0.0026121 **
                                -0.7506985
   as.factor(monthid)52
                                -0.5076356
                                             0.2341635
                                                        -2.1679 0.0304297
   as.factor(monthid)53
                                -0.5177776
                                             0.2313171
                                                        -2.2384 0.0254390
   as.factor(monthid)54
                                -0.6678057
                                             0.2278629
                                                        -2.9307 0.0034669 **
   as.factor(monthid)55
                                -0.5665830
                                             0.2291761
                                                        -2.4723 0.0136097 *
   as.factor(monthid)56
                                                        -3.1534 0.0016673 **
                                -0.7258611
                                             0.2301851
   as.factor(monthid)57
                                -0.3354864
                                             0.2307142
                                                        -1.4541 0.1462605
   as.factor(monthid)58
                                                        -2.4148 0.0159401 *
                                -0.5604078
                                             0.2320681
   as.factor(monthid)59
                                -0.6253399
                                             0.2334296
                                                        -2.6789 0.0075204 **
  as.factor(monthid)60
                                -0.4742272
                                             0.2412953
                                                        -1.9653 0.0496814 *
   as.factor(monthid)61
                                -0.5770582
                                             0.3889419
                                                        -1.4837 0.1382480
   as.factor(monthid)62
                                             0.3943757
                                                        -2.6064 0.0093016 **
                                -1.0278904
                                                        -2.7747 0.0056387 **
   as.factor(monthid)63
                                -1.1271364
                                             0.4062131
  as.factor(monthid)64
                                -1.0109430
                                             0.4105037
                                                        -2.4627 0.0139758
   as.factor(monthid)65
                                -1.1267184
                                             0.4147259
                                                        -2.7168 0.0067183
                                             0.4174823
   as.factor(monthid)66
                                                        -2.8268 0.0048052 **
                                -1.1801473
   as.factor(monthid)67
                                -1.2189658
                                             0.4286819
                                                        -2.8435 0.0045626 **
   as.factor(monthid)68
                                             0.4265937
                                                        -2.8028 0.0051745 **
                                -1.1956623
   as.factor(monthid)69
                                -0.9732750
                                             0.4160078
                                                        -2.3396 0.0195238 *
   as.factor(monthid)70
                                -1.0318123
                                             0.4099340
                                                        -2.5170 0.0120076 *
   as.factor(monthid)71
                                -0.9840160
                                             0.4054763
                                                        -2.4268 0.0154270 *
   as.factor(monthid)72
                                -0.7701735
                                             0.4043584
                                                        -1.9047 0.0571395
##
  lndidi
                                                         0.2844 0.7761906
                                 0.0061951
                                             0.0217853
## lnyidao
                                 0.0129125
                                             0.0095566
                                                         1.3512 0.1769835
## lnshenzhou
                                 0.0405590
                                             0.0466919
                                                         0.8687 0.3852681
## ln highwaypassengertraffic
                               -0.0087120
                                             0.0220301
                                                        -0.3955 0.6925978
```

```
## ln_aviationpassengertraffic -0.0187754 0.0252707 -0.7430 0.4576925
## ln_grpcity
                              ## ln_grppercapitacity
                                                    1.6940 0.0906168 .
                              0.1103599 0.0651488
## ln_mobilesubscriberscity
                              0.4381458 0.0978730
                                                    4.4767 8.552e-06 ***
## ln_internetsubscriberscity
                              0.0536145 0.0230535
                                                    2.3257 0.0202580 *
## ln roadarea
                             -3.4869207 1.3987437 -2.4929 0.0128490 *
## ln buses
                              3.5686769 1.4275764
                                                    2.4998 0.0126025 *
## ln_buspassengervolume
                              0.1075851 0.0713163
                                                    1.5086 0.1317608
                              0.0965000 0.0896606
## ln taxis
                                                   1.0763 0.2820890
## ln_busesper1000
                             -3.7118140 1.5630831 -2.3747 0.0177727 *
## ln_roadareapercapita
                              3.9729554 1.5395293
                                                    2.5806 0.0100190 *
## ln_populationcity
                              3.5187902 1.5111994
                                                    2.3285 0.0201071 *
## ln_populationdensitycity
                             -2.8631000 1.3494369 -2.1217 0.0341351 *
## ln_employedcity
                              0.0437285 0.0360742
                                                   1.2122 0.2257595
## ln_unemployedcity
                             -0.0694190
                                        0.0471090 -1.4736 0.1409432
## ln_wageofstaffandworkercity 0.0357507
                                        0.0307163
                                                    1.1639 0.2447720
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Total Sum of Squares:
                          125.8
## Residual Sum of Squares: 22.059
## R-Squared:
                 0.82465
## Adj. R-Squared: 0.80423
## F-statistic: 46.1074 on 92 and 902 DF, p-value: < 2.22e-16
```