**Practice** 

Assignment 4 exercises

Written answers

# Regression Assignment

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04/4/2024

```
rm(list = setdiff(ls(), lsf.str()))

# install.packages("reshape")
library("reshape")

# install.packages("ggplot2")
library("ggplot2")

# install.packages("GGally")
library("GGally")
```

### **Practice**

copy and paste your work by following each example from the lab manual for this exercise

```
setwd("C:/SSDFiles/GitStuff/iiith/Sem 4-2 spring24/Behavioural Research - Statistical Meth
ods/RegressionAssignment") # change this to your working directory where you've put the da
ta files, etc for this session
# setwd("~/Desktop/Work/BRSM_SP23/Lab")

# Simulate data y <- b1x1 + b2x2 + b0 with Normally distributed residuals. You can assume
sensible values for b1 b2 b0 as you please.
dat<-read.csv("housing.csv")
houselm <- lm(dat$median_house_value ~ dat$total_rooms + dat$median_income)

summary(houselm)</pre>
```

```
##
## Call:
## lm(formula = dat$median house value ~ dat$total rooms + dat$median income)
## Residuals:
##
      Min
              1Q Median
                              3Q
                                    Max
## -541275 -55944 -17010 36993 433865
##
## Coefficients:
##
                     Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                                 <2e-16 ***
                   45290.4598 1406.7797 32.194
## dat$total rooms
                      -0.1167
                                 0.2726 -0.428
                                                   0.669
## dat$median_income 41820.3923 313.0120 133.606 <2e-16 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 83740 on 20637 degrees of freedom
## Multiple R-squared: 0.4735, Adjusted R-squared: 0.4734
## F-statistic: 9278 on 2 and 20637 DF, p-value: < 2.2e-16
```

```
# Binary
mydata<-read.csv("binary.csv")
mydata$rank <- factor(mydata$rank)
fit <- glm(admit ~ gre + gpa + rank, data = mydata, family = "binomial")
summary(fit) # display results</pre>
```

```
##
## Call:
## glm(formula = admit ~ gre + gpa + rank, family = "binomial",
##
      data = mydata)
##
## Coefficients:
##
             Estimate Std. Error z value Pr(>|z|)
## (Intercept) -3.989979 1.139951 -3.500 0.000465 ***
         0.002264 0.001094 2.070 0.038465 *
## gre
            0.804038 0.331819 2.423 0.015388 *
## gpa
           ## rank2
           -1.340204 0.345306 -3.881 0.000104 ***
## rank3
## rank4
           ## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
      Null deviance: 499.98 on 399 degrees of freedom
## Residual deviance: 458.52 on 394 degrees of freedom
## AIC: 470.52
##
## Number of Fisher Scoring iterations: 4
```

#### confint(fit) # 95% CI for the coefficients

#### exp(coef(fit)) # exponentiated coefficients

```
## (Intercept) gre gpa rank2 rank3 rank4
## 0.0185001 1.0022670 2.2345448 0.5089310 0.2617923 0.2119375
```

#### exp(confint(fit)) # 95% CI for exponentiated coefficients

```
## 2.5 % 97.5 %

## (Intercept) 0.001889165 0.1665354

## gre    1.000137602 1.0044457

## gpa    1.173858216 4.3238349

## rank2    0.272289674 0.9448343

## rank3    0.131641717 0.5115181

## rank4    0.090715546 0.4706961
```

```
predict(fit, type="response") # predicted values
```

| ## | 1          | 2                 | 3          | 4          | 5          | 6          | 7          |
|----|------------|-------------------|------------|------------|------------|------------|------------|
| ## | 0.17262654 | 0.29217496        | 0.73840825 | 0.17838461 | 0.11835391 | 0.36996994 | 0.41924616 |
| ## | 8          | 9                 | 10         | 11         | 12         | 13         | 14         |
| ## | 0.21700328 | 0.20073518        | 0.51786820 | 0.37431440 | 0.40020025 | 0.72053858 | 0.35345462 |
| ## | <b>1</b> 5 | 16                | 17         | 18         | 19         | 20         | 21         |
| ## | 0.69237989 | 0.18582508        | 0.33993917 | 0.07895335 | 0.54022772 | 0.57351182 | 0.16122101 |
| ## | 22         | 23                | 24         | 25         | 26         | 27         | 28         |
| ## |            | 0.12837525        |            |            |            |            |            |
| ## | 29         | 30                | 31         | 32         | 33         | 34         | 35         |
| ## |            | 0.45829857        |            |            |            |            | 0.34296523 |
| ## | 36         | 37                | 38         | 39         | 40         | 41         | 42         |
| ## |            | 0.48413281        |            |            |            |            |            |
| ## | 43         | 44                | 45         | 46         | 47         | 48         | 49         |
| ## | 50         | 0.17702923<br>51  | 52         | 53         | 54         | 55         | 56         |
| ## |            | 0.31488795        |            |            |            |            |            |
| ## | 57         | 58                | 59         | 60         | 61         | 62         | 63         |
|    |            | 0.10853139        |            |            |            | -          |            |
| ## | 64         | 65                | 66         | 67         | 68         | 69         | 70         |
| ## | ٠.         | 0.30988311        |            | = -        |            |            | , -        |
| ## | 71         | 72                | 73         | 74         | 75         | 76         | 77         |
| ## | 0.33966212 | 0.07486000        |            |            |            |            | 0.20415281 |
| ## | 78         | 79                | 80         | 81         | 82         | 83         | 84         |
| ## | 0.42494837 | 0.43570986        | 0.65251556 | 0.16456653 | 0.31150713 | 0.20517359 | 0.08776685 |
| ## | 85         | 86                | 87         | 88         | 89         | 90         | 91         |
| ## | 0.21358749 | 0.25126279        | 0.34584314 | 0.37549461 | 0.55783057 | 0.51131037 | 0.49978497 |
| ## | 92         | 93                | 94         | 95         | 96         | 97         | 98         |
| ## | 0.63809471 | 0.57000341        | 0.26968427 | 0.40010880 | 0.37907977 | 0.22063013 | 0.33002244 |
| ## | 99         | 100               | 101        | 102        | 103        | 104        | 105        |
| ## | 0.31762762 | 0.14640896        | 0.11633954 | 0.24114689 | 0.11883427 | 0.28100436 | 0.50126183 |
| ## | 106        | 107               | 108        | 109        | 110        | 111        | 112        |
| ## | 0.35394219 | 0.61241920        | 0.25695415 | 0.11218813 | 0.30904921 | 0.17869743 | 0.13603549 |
| ## | 113        | 114               | 115        |            | 117        | 118        |            |
| ## | 0.10881750 | 0.48942091        |            | 0.32780508 | 0.29004920 | 0.47768876 | 0.68922540 |
| ## | 120        | 121               | 122        | 123        | 124        | 125        | 126        |
|    |            | 0.38205848        |            |            |            |            |            |
| ## |            | 128               |            |            | 131        | 132        |            |
|    |            | 0.29761787        |            |            |            |            |            |
| ## | 134        | 135<br>0.26397051 | 136        | 137        | 138        | 139        | 140        |
| ## | 141        | 142               | 143        | 144        | 145        | 146        | 147        |
|    |            | 0.24487554        |            |            |            |            |            |
| ## |            | 149               |            |            | 152        | 153        |            |
|    |            | 0.36278299        |            |            |            |            |            |
| ## | 155        | 156               | 157        | 158        | 159        | 160        | 161        |
|    |            | 0.12691355        |            |            |            |            |            |
| ## | 162        | 163               | 164        | 165        | 166        | 167        | 168        |
|    |            | 0.44572710        |            |            |            |            |            |
| ## | 169        | 170               | 171        |            | 173        | 174        | 175        |
|    |            | 0.25713529        |            |            |            |            |            |
| ## | 176        | 177               | 178        | 179        | 180        | 181        | 182        |
| ## | 0.36543032 | 0.20079352        | 0.20929210 | 0.22290898 | 0.09702710 | 0.29173405 | 0.21592659 |
|    |            |                   |            |            |            |            |            |

| ##   | 183  | 184   | 185  | 186  | 187  | 188  | 189  |
|--|--|---|--|--|--|--|--|
| ##   | 0.53390445   | 0.41213948  | 0.10284874   | 0.51016205   | 0.23875288   | 0.26184001   | 0.28313813   |
| ##   | 190  | 191   | 192  | 193  | 194  | 195  | 196  |
| ##   | 0.30160149   | 0.29894660  | 0.33797096   | 0.29780561   | 0.14252603   | 0.37361105   | 0.37499458   |
| ##   | 197  | 198   | 199  | 200  | 201  | 202  | 203  |
| ##   | 0.20306181   | 0.11520619  | 0.25867413   | 0.23203530   | 0.29790835   | 0.31450637   | 0.69237989   |
| ##   | 204  | 205   | 206  | 207  | 208  | 209  | 210  |
| ##   | 0.19176895   | 0.62160882  | 0.37552455   | 0.62994688   | 0.59336886   | 0.17269671   | 0.36867073   |
| ##   | 211  | 212   | 213  | 214  | 215  | 216  | 217  |
| ##   | 0.23500145   | 0.28417171  | 0.21145148   | 0.23806753   | 0.39069474   | 0.18303592   | 0.29144726   |
| ##   | 218  | 219   | 220  | 221  | 222  | 223  | 224  |
| ##   | 0.49458858   | 0.36532833  | 0.37499458   | 0.18691983   | 0.35841190   | 0.38346629   | 0.32549498   |
| ##   | 225  | 226   | 227  | 228  | 229  | 230  | 231  |
| ##   | 0.37234438   | 0.29200523  | 0.40539785   | 0.13119209   | 0.30562595   | 0.42917277   | 0.17040039   |
| ##   | 232  | 233   | 234  | 235  | 236  | 237  | 238  |
| ##   | 0.20845157   | 0.25212831  | 0.09688336   | 0.65921863   | 0.30806878   | 0.40979572   | 0.41039144   |
| ##   | 239  | 240   | 241  | 242  | 243  | 244  | 245  |
| ##   | 0.10815929   | 0.27465027  | 0.19001218   | 0.56239934   | 0.19616746   | 0.33794240   | 0.41996550   |
| ##   | 246  | 247   | 248  | 249  | 250  | 251  | 252  |
| ##   | 0.40736827   | 0.39171070  | 0.24596016   | 0.29657173   | 0.29278619   | 0.20011793   | 0.17414395   |
| ##   | 253  | 254   | 255  | 256  | 257  | 258  | 259  |
| ##   | 0.43247252   | 0.18780755  | 0.26200847   | 0.23371984   | 0.30267400   | 0.32075797   | 0.33944941   |
| ##   | 260  | 261   | 262  | 263  | 264  | 265  | 266  |
| ##   | 0.46187255   | 0.34863249  | 0.24298996   | 0.16969339   | 0.32075797   | 0.26562483   | 0.14378335   |
| ##   | 267  | 268   | 269  | 270  | 271  | 272  | 273  |
| ##   | 0.15865328   | 0.26021896  | 0.41492493   | 0.12579904   | 0.48994106   | 0.19310678   | 0.45641226   |
| ##   | 274  | 275   | 276  | 277  | 278  | 279  | 280  |
| ##   | 0.54337733   | 0.27302605  | 0.28684953   | 0.22143462   | 0.55028996   | 0.16945136   | 0.34384116   |
| ##   | 281  | 282   | 283  | 284  | 285  | 286  | 287  |
| ##   | 0.49925174   | 0.13172559  | 0.21874547   | 0.13337693   | 0.28021662   | 0.17925207   | 0.60122274   |
| ##   | 288  | 289   | 290  | 291  | 292  | 293  | 294  |
| ##   | 0.25502619   | 0.23197657  | 0.05878643   | 0.38047126   | 0.35008696   | 0.46240272   | 0.73372225   |
| ##   | 295  | 296   | 297  | 298  | 299  | 300  | 301  |
| ##   | 0.29885443   | 0.17659931  | 0.45483793   | 0.23950580   | 0.34785059   | 0.27566478   | 0.36288468   |
| ##   | 302  | 303   | 204  |  |  |  |  |
| ##   |  |   | 304  | 305  | 306  | 307  | 308  |
| ##   | 0.28067279   |   | 0.51860565   | 0.07198547   | 0.19060160   |  | 0.37054412   |
| ##   | 309  | 310   | 0.51860565<br>311  | 0.07198547<br>312  | 0.19060160<br>313  | 0.44561844<br>314  | 0.37054412<br>315  |
| ##   | 309<br>0.28373804  | 310   | 0.51860565<br>311<br>0.30028221  | 0.07198547<br>312<br>0.44520022  | 0.19060160<br>313<br>0.30907647  | 0.44561844<br>314  | 0.37054412<br>315  |
| ##<br>##                                     | 309<br>0.28373804<br>316   | 310<br>0.12588934<br>317  | 0.51860565<br>311<br>0.30028221<br>318   | 0.07198547<br>312<br>0.44520022<br>319   | 0.19060160<br>313<br>0.30907647<br>320   | 0.44561844<br>314<br>0.19322270<br>321   | 0.37054412<br>315<br>0.17701800<br>322   |
| ##<br>##<br>##                               | 309<br>0.28373804<br>316<br>0.15412239   | 310<br>0.12588934<br>317<br>0.18491373  | 0.51860565<br>311<br>0.30028221<br>318<br>0.29806393   | 0.07198547<br>312<br>0.44520022<br>319<br>0.18670880   | 0.19060160<br>313<br>0.30907647<br>320<br>0.46755914   | 0.44561844<br>314<br>0.19322270<br>321<br>0.14630641   | 0.37054412<br>315<br>0.17701800<br>322<br>0.32183935   |
| ##<br>##<br>##<br>##                         | 309 0.28373804 316 0.15412239 323  | 310<br>0.12588934<br>317<br>0.18491373<br>324   | 0.51860565<br>311<br>0.30028221<br>318<br>0.29806393<br>325  | 0.07198547<br>312<br>0.44520022<br>319<br>0.18670880<br>326  | 0.19060160<br>313<br>0.30907647<br>320<br>0.46755914<br>327  | 0.44561844<br>314<br>0.19322270<br>321<br>0.14630641<br>328  | 0.37054412<br>315<br>0.17701800<br>322<br>0.32183935<br>329  |
| ##<br>##<br>##<br>##                         | 309 0.28373804 316 0.15412239 323 0.12035456   | 310<br>0.12588934<br>317<br>0.18491373<br>324<br>0.17486941   | 0.51860565<br>311<br>0.30028221<br>318<br>0.29806393<br>325<br>0.12112920  | 0.07198547<br>312<br>0.44520022<br>319<br>0.18670880<br>326<br>0.66498227  | 0.19060160<br>313<br>0.30907647<br>320<br>0.46755914<br>327<br>0.38597852  | 0.44561844<br>314<br>0.19322270<br>321<br>0.14630641<br>328<br>0.35450549  | 0.37054412<br>315<br>0.17701800<br>322<br>0.32183935<br>329<br>0.33926538  |
| ##<br>##<br>##<br>##<br>##                   | 309 0.28373804 316 0.15412239 323 0.12035456 330   | 310<br>0.12588934<br>317<br>0.18491373<br>324<br>0.17486941<br>331  | 0.51860565<br>311<br>0.30028221<br>318<br>0.29806393<br>325<br>0.12112920<br>332   | 0.07198547<br>312<br>0.44520022<br>319<br>0.18670880<br>326<br>0.66498227<br>333   | 0.19060160<br>313<br>0.30907647<br>320<br>0.46755914<br>327<br>0.38597852<br>334   | 0.44561844<br>314<br>0.19322270<br>321<br>0.14630641<br>328<br>0.35450549  | 0.37054412<br>315<br>0.17701800<br>322<br>0.32183935<br>329<br>0.33926538<br>336   |
| ##<br>##<br>##<br>##<br>##                   | 309 0.28373804 316 0.15412239 323 0.12035456 330 0.11370930  | 310<br>0.12588934<br>317<br>0.18491373<br>324<br>0.17486941<br>331<br>0.39213236  | 0.51860565<br>311<br>0.30028221<br>318<br>0.29806393<br>325<br>0.12112920<br>332<br>0.27905234   | 0.07198547<br>312<br>0.44520022<br>319<br>0.18670880<br>326<br>0.66498227<br>333<br>0.34097123   | 0.19060160<br>313<br>0.30907647<br>320<br>0.46755914<br>327<br>0.38597852<br>334<br>0.21344965   | 0.44561844<br>314<br>0.19322270<br>321<br>0.14630641<br>328<br>0.35450549<br>335<br>0.20393972   | 0.37054412<br>315<br>0.17701800<br>322<br>0.32183935<br>329<br>0.33926538<br>336<br>0.59795326   |
| ##<br>##<br>##<br>##<br>##<br>##             | 309 0.28373804 316 0.15412239 323 0.12035456 330 0.11370930 337  | 310<br>0.12588934<br>317<br>0.18491373<br>324<br>0.17486941<br>331<br>0.39213236<br>338   | 0.51860565<br>311<br>0.30028221<br>318<br>0.29806393<br>325<br>0.12112920<br>332<br>0.27905234<br>339                                    | 0.07198547<br>312<br>0.44520022<br>319<br>0.18670880<br>326<br>0.66498227<br>333<br>0.34097123<br>340  | 0.19060160<br>313<br>0.30907647<br>320<br>0.46755914<br>327<br>0.38597852<br>334<br>0.21344965<br>341  | 0.44561844<br>314<br>0.19322270<br>321<br>0.14630641<br>328<br>0.35450549<br>335<br>0.20393972<br>342  | 0.37054412<br>315<br>0.17701800<br>322<br>0.32183935<br>329<br>0.33926538<br>336<br>0.59795326<br>343  |
| ##<br>##<br>##<br>##<br>##<br>##             | 309 0.28373804 316 0.15412239 323 0.12035456 330 0.11370930 337 0.16520993                                   | 310<br>0.12588934<br>317<br>0.18491373<br>324<br>0.17486941<br>331<br>0.39213236<br>338<br>0.16070084                             | 0.51860565<br>311<br>0.30028221<br>318<br>0.29806393<br>325<br>0.12112920<br>332<br>0.27905234<br>339<br>0.45158492                      | 0.07198547<br>312<br>0.44520022<br>319<br>0.18670880<br>326<br>0.66498227<br>333<br>0.34097123<br>340<br>0.26006097  | 0.19060160<br>313<br>0.30907647<br>320<br>0.46755914<br>327<br>0.38597852<br>334<br>0.21344965<br>341<br>0.14037382  | 0.44561844<br>314<br>0.19322270<br>321<br>0.14630641<br>328<br>0.35450549<br>335<br>0.20393972<br>342<br>0.12659514  | 0.37054412<br>315<br>0.17701800<br>322<br>0.32183935<br>329<br>0.33926538<br>336<br>0.59795326<br>343<br>0.22560760  |
| ##<br>##<br>##<br>##<br>##<br>##<br>##       | 309 0.28373804 316 0.15412239 323 0.12035456 330 0.11370930 337 0.16520993 344                               | 310<br>0.12588934<br>317<br>0.18491373<br>324<br>0.17486941<br>331<br>0.39213236<br>338<br>0.16070084                             | 0.51860565<br>311<br>0.30028221<br>318<br>0.29806393<br>325<br>0.12112920<br>332<br>0.27905234<br>339<br>0.45158492<br>346               | 0.07198547<br>312<br>0.44520022<br>319<br>0.18670880<br>326<br>0.66498227<br>333<br>0.34097123<br>340<br>0.26006097<br>347   | 0.19060160<br>313<br>0.30907647<br>320<br>0.46755914<br>327<br>0.38597852<br>334<br>0.21344965<br>341<br>0.14037382<br>348   | 0.44561844<br>314<br>0.19322270<br>321<br>0.14630641<br>328<br>0.35450549<br>335<br>0.20393972<br>342<br>0.12659514<br>349   | 0.37054412<br>315<br>0.17701800<br>322<br>0.32183935<br>329<br>0.33926538<br>336<br>0.59795326<br>343<br>0.22560760<br>350   |
| ##<br>##<br>##<br>##<br>##<br>##<br>##       | 309 0.28373804 316 0.15412239 323 0.12035456 330 0.11370930 337 0.16520993 344 0.29075910                    | 310<br>0.12588934<br>317<br>0.18491373<br>324<br>0.17486941<br>331<br>0.39213236<br>338<br>0.16070084<br>345<br>0.18859648        | 0.51860565<br>311<br>0.30028221<br>318<br>0.29806393<br>325<br>0.12112920<br>332<br>0.27905234<br>339<br>0.45158492<br>346<br>0.14657301 | 0.07198547<br>312<br>0.44520022<br>319<br>0.18670880<br>326<br>0.66498227<br>333<br>0.34097123<br>340<br>0.26006097<br>347<br>0.35132030                             | 0.19060160<br>313<br>0.30907647<br>320<br>0.46755914<br>327<br>0.38597852<br>334<br>0.21344965<br>341<br>0.14037382<br>348<br>0.42636137                             | 0.44561844<br>314<br>0.19322270<br>321<br>0.14630641<br>328<br>0.35450549<br>335<br>0.20393972<br>342<br>0.12659514<br>349<br>0.25767548                             | 0.37054412<br>315<br>0.17701800<br>322<br>0.32183935<br>329<br>0.33926538<br>336<br>0.59795326<br>343<br>0.22560760<br>350<br>0.27488628                             |
| ##<br>##<br>##<br>##<br>##<br>##<br>##       | 309 0.28373804 316 0.15412239 323 0.12035456 330 0.11370930 337 0.16520993 344 0.29075910 351                | 310<br>0.12588934<br>317<br>0.18491373<br>324<br>0.17486941<br>331<br>0.39213236<br>338<br>0.16070084<br>345<br>0.18859648<br>352 | 0.51860565 311 0.30028221 318 0.29806393 325 0.12112920 332 0.27905234 339 0.45158492 346 0.14657301 353                                 | 0.07198547<br>312<br>0.44520022<br>319<br>0.18670880<br>326<br>0.66498227<br>333<br>0.34097123<br>340<br>0.26006097<br>347<br>0.35132030<br>354                      | 0.19060160<br>313<br>0.30907647<br>320<br>0.46755914<br>327<br>0.38597852<br>334<br>0.21344965<br>341<br>0.14037382<br>348<br>0.42636137                             | 0.44561844<br>314<br>0.19322270<br>321<br>0.14630641<br>328<br>0.35450549<br>335<br>0.20393972<br>342<br>0.12659514<br>349<br>0.25767548<br>356                      | 0.37054412<br>315<br>0.17701800<br>322<br>0.32183935<br>329<br>0.33926538<br>336<br>0.59795326<br>343<br>0.22560760<br>350<br>0.27488628<br>357                      |
| ##<br>##<br>##<br>##<br>##<br>##<br>##       | 309 0.28373804 316 0.15412239 323 0.12035456 330 0.11370930 337 0.16520993 344 0.29075910 351 0.57858815     | 310 0.12588934 317 0.18491373 324 0.17486941 331 0.39213236 338 0.16070084 345 0.18859648 352 0.23714608                          | 0.51860565 311 0.30028221 318 0.29806393 325 0.12112920 332 0.27905234 339 0.45158492 346 0.14657301 353 0.18120291                      | 0.07198547<br>312<br>0.44520022<br>319<br>0.18670880<br>326<br>0.66498227<br>333<br>0.34097123<br>340<br>0.26006097<br>347<br>0.35132030<br>354<br>0.43779599        | 0.19060160<br>313<br>0.30907647<br>320<br>0.46755914<br>327<br>0.38597852<br>334<br>0.21344965<br>341<br>0.14037382<br>348<br>0.42636137<br>355<br>0.40050290        | 0.44561844<br>314<br>0.19322270<br>321<br>0.14630641<br>328<br>0.35450549<br>335<br>0.20393972<br>342<br>0.12659514<br>349<br>0.25767548<br>356<br>0.49758253        | 0.37054412<br>315<br>0.17701800<br>322<br>0.32183935<br>329<br>0.33926538<br>336<br>0.59795326<br>343<br>0.22560760<br>350<br>0.27488628<br>357<br>0.38909423        |
| ##<br>##<br>##<br>##<br>##<br>##<br>##<br>## | 309 0.28373804 316 0.15412239 323 0.12035456 330 0.11370930 337 0.16520993 344 0.29075910 351 0.57858815 358 | 310 0.12588934 317 0.18491373 324 0.17486941 331 0.39213236 338 0.16070084 345 0.18859648 352 0.23714608 359                      | 0.51860565 311 0.30028221 318 0.29806393 325 0.12112920 332 0.27905234 339 0.45158492 346 0.14657301 353                                 | 0.07198547<br>312<br>0.44520022<br>319<br>0.18670880<br>326<br>0.66498227<br>333<br>0.34097123<br>340<br>0.26006097<br>347<br>0.35132030<br>354<br>0.43779599<br>361 | 0.19060160<br>313<br>0.30907647<br>320<br>0.46755914<br>327<br>0.38597852<br>334<br>0.21344965<br>341<br>0.14037382<br>348<br>0.42636137<br>355<br>0.40050290<br>362 | 0.44561844<br>314<br>0.19322270<br>321<br>0.14630641<br>328<br>0.35450549<br>335<br>0.20393972<br>342<br>0.12659514<br>349<br>0.25767548<br>356<br>0.49758253<br>363 | 0.37054412<br>315<br>0.17701800<br>322<br>0.32183935<br>329<br>0.33926538<br>336<br>0.59795326<br>343<br>0.22560760<br>350<br>0.27488628<br>357<br>0.38909423<br>364 |

```
##
          365
                     366
                                367
                                           368
                                                       369
                                                                  370
                                                                             371
## 0.49491656 0.11836196 0.12645014 0.26745319 0.63170496 0.56803162 0.39857395
                                                                  377
                     373
                                374
                                           375
                                                       376
          372
## 0.31708679 0.37650752 0.53085361 0.41142403 0.18735742 0.41512421 0.58958954
##
          379
                     380
                                381
                                           382
                                                       383
                                                                  384
                                                                             385
## 0.20223990 0.21896113 0.46366743 0.34602886 0.34967678 0.67275941 0.18665107
          386
                                           389
                                                       390
                     387
                                388
                                                                  391
                                                                             392
## 0.35189341 0.52842881 0.34287938 0.33908140 0.40275050 0.40093595 0.48719398
          393
                     394
                                395
                                           396
                                                       397
                                                                             399
##
                                                                  398
## 0.22202911 0.43872524 0.25342327 0.48866999 0.16550430 0.18106222 0.46366743
##
          400
## 0.30073055
```

residuals(fit, type="deviance") # residuals

| ## | 1                | 2                | 3                | 4                 | 5          | 6                | 7               |
|----|------------------|------------------|------------------|-------------------|------------|------------------|-----------------|
| ## | -0.6156283       | 1.5686953        | 0.7787919        | 1.8567786         | -0.5019254 | 1.4102011        | 1.3185576       |
| ## | 8                | 9                | 10               | 11                | 12         | 13               | 14              |
| ## | -0.6994666       | 1.7920763        | -1.2079220       | -0.9684083        | -1.0110978 | 0.8096373        | -0.9339292      |
| ## | 15               | 16               | 17               | 18                | 19         | 20               | 21              |
| ## |                  | -0.6412177       | -0.9115078       | -0.4055727        | -1.2466146 | 1.0544920        | -0.5929722      |
| ## | 22               | 23               | 24               | 25                | 26         | 27               | 28              |
| ## |                  | -0.5242066       |                  |                   |            |                  |                 |
| ## | 29               | 30               | 31               | 32                | 33         | 34               | 35              |
| ## |                  | -1.1072852       |                  |                   |            |                  | -0.9165351      |
| ## | 36               | 1 1505702        | 38               | 39                | 40         | 41               | 42              |
| ## | 43               | -1.1505702<br>44 | -0.5477760<br>45 | 1.6281299<br>46   | 47         | -0.6487285<br>48 | 1.4775836<br>49 |
| ## |                  | -0.6242349       |                  |                   | • •        | -0.4988384       |                 |
| ## | 50               | 51               | 52               | 53                | 54         | 55               | 56              |
|    |                  | -0.8696814       |                  |                   |            | -0.7416713       | 1.3683244       |
| ## | 57               | 58               | 59               | 60                | 61         | 62               | 63              |
|    | -0.6354843       | -0.4793434       | -0.8525757       | -0.5242066        | 1.4874730  | -0.6053704       | -0.8155206      |
| ## | 64               | 65               | 66               | 67                | 68         | 69               | 70              |
| ## | 1.4830602        | -0.8612715       | -1.0049172       | -0.8068734        | -1.2061156 | -1.3029097       | -1.5397236      |
| ## | 71               | 72               | 73               | 74                | 75         | 76               | 77              |
| ## | -0.9110473       | -0.3944875       | -0.5716407       | -1.1202694        | -0.7459111 | -0.9800843       | -0.6757930      |
| ## | 78               | 79               | 80               | 81                | 82         | 83               | 84              |
| ## | 1.3082718        | -1.0697539       | 0.9240349        | -0.5996742        | -0.8640027 | -0.6776895       | -0.4286250      |
| ## | 85               | 86               | 87               | 88                | 89         | 90               | 91              |
| ## | 1.7571048        | -0.7607460       | -0.9213122       | -0.9703559        | -1.2775462 | 1.1582560        | -1.1770448      |
| ## | 92               | 93               | 94               | 95                | 96         | 97               | 98              |
| ## |                  | -1.2992136       |                  |                   |            |                  |                 |
| ## | 99               | 100              | 101              | 102               | 103        | 104              | 105             |
|    |                  | -0.5626777       |                  |                   |            |                  |                 |
| ## | 106<br>1.4412645 | 107              | 108              | 109               | 110        | 111              | 112             |
| ## |                  | 114              |                  | -0.4878430<br>116 | 117        |                  |                 |
|    |                  | -1.1594910       |                  |                   |            |                  |                 |
| ## | 120              | 121              |                  | 123               | 124        | 125              | 126             |
|    |                  | 1.3872142        |                  |                   |            |                  |                 |
| ## |                  |                  |                  |                   | 131        |                  | 133             |
| ## | 1.0875917        | -0.8405685       |                  |                   |            | -0.8007693       | -0.9284741      |
| ## | 134              | 135              | 136              | 137               | 138        | 139              | 140             |
| ## | -0.5735675       | -0.7829241       | -0.6858141       | -0.6075976        | -0.9625498 | -0.9630061       | 1.0744269       |
| ## | 141              | 142              | 143              | 144               | 145        | 146              | 147             |
| ## | -1.1535880       | 1.6775012        | -0.8019118       | -0.6995062        | -0.6363124 | -0.5761326       | -0.8454987      |
| ## | 148              | 149              | 150              | 151               | 152        | 153              | 154             |
| ## | -0.5321532       | 1.4240438        | -1.3278996       | 0.8512371         | -0.7773509 | 1.1979811        | -0.7145961      |
| ## | 155              | 156              | 157              | 158               | 159        | 160              | 161             |
| ## | -0.8054319       | 2.0318706        |                  | 1.1878745         |            | -0.9077473       | -0.8650680      |
| ## | 162              | 163              | 164              | 165               | 166        | 167              | 168             |
|    |                  | 1.2712580        |                  |                   |            |                  |                 |
| ## | 169              | 170              | 171              | 172               |            | 174              |                 |
|    |                  | -0.7710270       |                  |                   |            |                  |                 |
| ## | 176              |                  | 178              |                   |            | 181              | 182             |
| ## | 1.4189289        | -0.6695311       | 1./686291        | -0./102081        | -0.4518025 | -0.8305849       | -0.69/4993      |

| ##   | 183  | 184   | 185  | 186  | 187   | 188   | 189   |
|--|--|---|--|--|---|---|---|
| ##   | -1.2356089   |   |  | -1.1947223   |   |   |   |
| ##   | 190  | 191   | 192  | 193  | 194   | 195   | 196   |
|  | -0.8473080   |   |  | -0.8408864   |   |   | -0.9695308  |
| ##   | 197  | 198   | 199  | 200  | 201   | 202   | 203   |
|  |  |   |  | -0.7266519   |   | 1.5210200   | 0.8574619   |
|  | -0.6737628<br>204  | 2.0769373   | 206  | 207  | 208   | 209   | 210   |
| ##   |  |   |  |  |   |   |   |
| ##   | -0.6525447   | 0.9751352   |  | -1.4100416   |   | -0.6157661  |   |
| ##   | 211  | 212   | 213  | 214  | 215   | 216   | 217   |
| ##   |  | -0.8176979  |  |  | 1.3710060   |   | -0.8300973  |
| ##   | 218  | 219   | 220  | 221  | 222   | 223   | 224   |
| ##   |  | -0.9535696  |  | -0.6433126   |   |   | -0.8874415  |
| ##   | 225  | 226   | 227  | 228  | 229   | 230   | 231   |
| ##   | -0.9651566   |   |  | -0.5303456   |   |   | -0.6112481  |
| ##   | 232  | 233   | 234  | 235  | 236   | 237   | 238   |
|  |  | -0.7622649  |  |  | -0.8582176  |   | -1.0279070  |
| ##   | 239  | 240   | 241  | 242  | 243   | 244   | 245   |
| ##   | -0.4784720   | -0.8013755  | -0.6492089   | 1.0728869  | 1.8048749   | -0.9081880  |   |
| ##   | 246  | 247   | 248  | 249  | 250   | 251   | 252   |
| ##   | -1.0229195   | -0.9971005  | -0.7514121   | -0.8387960   | -0.8323728  | -0.6682679  | -0.6186029  |
| ##   | 253  | 254   | 255  | 256  | 257   | 258   | 259   |
| ##   | 1.2947869  | 1.8288453   | 1.6366908  | -0.7296676   | 1.5460265   | 1.5080242   | -0.9106938  |
| ##   | 260  | 261   | 262  | 263  | 264   | 265   | 266   |
| ##   | -1.1132474   | -0.9259387  | -0.7461619   | 1.8834872  | 1.5080242   | 1.6282938   | -0.5571927  |
| ##   | 267  | 268   | 269  | 270  | 271   | 272   | 273   |
| ##   | -0.5877949   | 1.6408729   | 1.3263918  | -0.5185460   | 1.1945461   | -0.6550785  | 1.2524846   |
| ##   | 274  | 275   | 276  | 277  | 278   | 279   | 280   |
| ##   | -1.2521165   | -0.7985795  | 1.5803781  | -0.7075342   | 1.0929867   | 1.8842449   | 1.4612156   |
| ##   | 281  | 282   | 283  | 284  | 285   | 286   | 287   |
| ##   | -1.1761393   | -0.5315025  | -0.7026440   | -0.5350722   | 1.5951127   | -0.6285527  | 1.0087515   |
| ##   | 288  | 289   | 290  | 291  | 292   | 293   | 294   |
| ##   | 1.6531116  | -0.7265467  | -0.3480954   | 1.3902120  | -0.9283498  | -1.1141324  | -1.6267854  |
| ##   | 295  | 296   | 297  | 298  | 299   | 300   | 301   |
| ##   | -0.8426621   | -0.6233977  | -1.1015191   | -0.7399821   | -0.9246422  | -0.8031201  | -0.9495310  |
| ##   | 302  | 303   | 304  | 305  | 306   | 307   | 308   |
| ##   | 1.5940927  | 1.7228149   | 1 1/5050/  |  |   |   |   |
| ##   |  |   | 1.14000004   | -0.3865434   | -0.6503292  | 1.2714497   | -0.9621845  |
|  | 309  | 310   | 311  | -0.3865434<br>312  | -0.6503292<br>313   | 1.2714497<br>314  | -0.9621845<br>315   |
| ##   |  |   | 311  | 312  | 313   | 314   |   |
| ##<br>##                                     |  | 310   | 311  | 312  | 313   | 314   | 315   |
| ##   | -0.8169569<br>316  | 310<br>-0.5187452   | 311<br>-0.8450777<br>318   | 312<br>-1.0854934<br>319   | 313<br>-0.8599141<br>320  | 314<br>1.8132357<br>321   | 315<br>-0.6242130<br>322  |
| ##   | -0.8169569<br>316  | 310<br>-0.5187452<br>317  | 311<br>-0.8450777<br>318   | 312<br>-1.0854934<br>319   | 313<br>-0.8599141<br>320  | 314<br>1.8132357<br>321<br>-0.5624641   | 315<br>-0.6242130<br>322  |
| ##<br>##<br>##                               | -0.8169569<br>316<br>1.9339122<br>323  | 310<br>-0.5187452<br>317<br>1.8373165   | 311<br>-0.8450777<br>318<br>1.5559224<br>325   | 312<br>-1.0854934<br>319<br>1.8320508<br>326   | 313<br>-0.8599141<br>320<br>-1.1227497<br>327   | 314<br>1.8132357<br>321<br>-0.5624641<br>328  | 315<br>-0.6242130<br>322<br>-0.8813298  |
| ##<br>##<br>##                               | -0.8169569<br>316<br>1.9339122<br>323<br>-0.5064314  | 310<br>-0.5187452<br>317<br>1.8373165<br>324  | 311<br>-0.8450777<br>318<br>1.5559224<br>325   | 312<br>-1.0854934<br>319<br>1.8320508<br>326   | 313<br>-0.8599141<br>320<br>-1.1227497<br>327   | 314<br>1.8132357<br>321<br>-0.5624641<br>328  | 315 -0.6242130 322 -0.8813298 329   |
| ##<br>##<br>##<br>##                         | -0.8169569<br>316<br>1.9339122<br>323<br>-0.5064314<br>330   | 310 -0.5187452 317 1.8373165 324 -0.6200220   | 311 -0.8450777 318 1.5559224 325 -0.5081680 332  | 312 -1.0854934 319 1.8320508 326 -1.4788995 333  | 313 -0.8599141 320 -1.1227497 327 -0.9876491 334  | 314 1.8132357 321 -0.5624641 328 1.4401607 335  | 315 -0.6242130 322 -0.8813298 329 -0.9103878  |
| ##<br>##<br>##<br>##                         | -0.8169569<br>316<br>1.9339122<br>323<br>-0.5064314<br>330   | 310 -0.5187452 317 1.8373165 324 -0.6200220 331   | 311 -0.8450777 318 1.5559224 325 -0.5081680 332  | 312 -1.0854934 319 1.8320508 326 -1.4788995 333  | 313 -0.8599141 320 -1.1227497 327 -0.9876491 334  | 314 1.8132357 321 -0.5624641 328 1.4401607 335 1.7832167  | 315 -0.6242130 322 -0.8813298 329 -0.9103878 336  |
| ##<br>##<br>##<br>##<br>##<br>##             | -0.8169569<br>316<br>1.9339122<br>323<br>-0.5064314<br>330<br>-0.4913457                               | 310 -0.5187452 317 1.8373165 324 -0.6200220 331 -0.9977957  | 311 -0.8450777 318 1.5559224 325 -0.5081680 332 -0.8089360 339   | 312 -1.0854934 319 1.8320508 326 -1.4788995 333 -0.9132230 340   | 313 -0.8599141 320 -1.1227497 327 -0.9876491 334 -0.6929625 341   | 314 1.8132357 321 -0.5624641 328 1.4401607 335 1.7832167 342  | 315 -0.6242130 322 -0.8813298 329 -0.9103878 336 1.0141427 343  |
| ##<br>##<br>##<br>##<br>##<br>##             | -0.8169569<br>316<br>1.9339122<br>323<br>-0.5064314<br>330<br>-0.4913457                               | 310 -0.5187452 317 1.8373165 324 -0.6200220 331 -0.9977957 338  | 311 -0.8450777 318 1.5559224 325 -0.5081680 332 -0.8089360 339   | 312 -1.0854934 319 1.8320508 326 -1.4788995 333 -0.9132230 340 1.6412429                                   | 313 -0.8599141 320 -1.1227497 327 -0.9876491 334 -0.6929625 341   | 314 1.8132357 321 -0.5624641 328 1.4401607 335 1.7832167 342  | 315 -0.6242130 322 -0.8813298 329 -0.9103878 336 1.0141427 343  |
| ##<br>##<br>##<br>##<br>##<br>##             | -0.8169569 316 1.9339122 323 -0.5064314 330 -0.4913457 337 -0.6009576                                  | 310 -0.5187452 317 1.8373165 324 -0.6200220 331 -0.9977957 338 -0.5919258                               | 311 -0.8450777 318 1.5559224 325 -0.5081680 332 -0.8089360 339 -1.0961048 346                              | 312 -1.0854934 319 1.8320508 326 -1.4788995 333 -0.9132230 340 1.6412429 347                               | 313 -0.8599141 320 -1.1227497 327 -0.9876491 334 -0.6929625 341 -0.5500139 348                              | 314 1.8132357 321 -0.5624641 328 1.4401607 335 1.7832167 342 2.0331066 349                              | 315 -0.6242130 322 -0.8813298 329 -0.9103878 336 1.0141427 343 -0.7150896 350                               |
| ##<br>##<br>##<br>##<br>##<br>##             | -0.8169569 316 1.9339122 323 -0.5064314 330 -0.4913457 337 -0.6009576                                  | 310 -0.5187452 317 1.8373165 324 -0.6200220 331 -0.9977957 338 -0.5919258 345                           | 311 -0.8450777 318 1.5559224 325 -0.5081680 332 -0.8089360 339 -1.0961048 346                              | 312 -1.0854934 319 1.8320508 326 -1.4788995 333 -0.9132230 340 1.6412429 347                               | 313 -0.8599141 320 -1.1227497 327 -0.9876491 334 -0.6929625 341 -0.5500139 348                              | 314 1.8132357 321 -0.5624641 328 1.4401607 335 1.7832167 342 2.0331066 349                              | 315 -0.6242130 322 -0.8813298 329 -0.9103878 336 1.0141427 343 -0.7150896 350                               |
| ##<br>##<br>##<br>##<br>##<br>##<br>##       | -0.8169569 316 1.9339122 323 -0.5064314 330 -0.4913457 337 -0.6009576 344 -0.8289271 351               | 310 -0.5187452 317 1.8373165 324 -0.6200220 331 -0.9977957 338 -0.5919258 345 -0.6465134                | 311 -0.8450777 318 1.5559224 325 -0.5081680 332 -0.8089360 339 -1.0961048 346 -0.5630192 353               | 312 -1.0854934 319 1.8320508 326 -1.4788995 333 -0.9132230 340 1.6412429 347 -0.9303937                    | 313 -0.8599141 320 -1.1227497 327 -0.9876491 334 -0.6929625 341 -0.5500139 348 -1.0542824 355               | 314 1.8132357 321 -0.5624641 328 1.4401607 335 1.7832167 342 2.0331066 349 -0.7719699 356               | 315 -0.6242130 322 -0.8813298 329 -0.9103878 336 1.0141427 343 -0.7150896 350 -0.8017815                    |
| ##<br>##<br>##<br>##<br>##<br>##<br>##       | -0.8169569 316 1.9339122 323 -0.5064314 330 -0.4913457 337 -0.6009576 344 -0.8289271 351 1.0461017     | 310 -0.5187452 317 1.8373165 324 -0.6200220 331 -0.9977957 338 -0.5919258 345 -0.6465134 352            | 311 -0.8450777 318 1.5559224 325 -0.5081680 332 -0.8089360 339 -1.0961048 346 -0.5630192 353 1.8483170     | 312 -1.0854934 319 1.8320508 326 -1.4788995 333 -0.9132230 340 1.6412429 347 -0.9303937 354 -1.0732106     | 313 -0.8599141 320 -1.1227497 327 -0.9876491 334 -0.6929625 341 -0.5500139 348 -1.0542824 355 1.3528003     | 314 1.8132357 321 -0.5624641 328 1.4401607 335 1.7832167 342 2.0331066 349 -0.7719699 356               | 315 -0.6242130 322 -0.8813298 329 -0.9103878 336 1.0141427 343 -0.7150896 350 -0.8017815                    |
| ##<br>##<br>##<br>##<br>##<br>##<br>##<br>## | -0.8169569 316 1.9339122 323 -0.5064314 330 -0.4913457 337 -0.6009576 344 -0.8289271 351 1.0461017 358 | 310 -0.5187452 317 1.8373165 324 -0.6200220 331 -0.9977957 338 -0.5919258 345 -0.6465134 352 -0.7357836 | 311 -0.8450777 318 1.5559224 325 -0.5081680 332 -0.8089360 339 -1.0961048 346 -0.5630192 353 1.8483170 360 | 312 -1.0854934 319 1.8320508 326 -1.4788995 333 -0.9132230 340 1.6412429 347 -0.9303937 354 -1.0732106 361 | 313 -0.8599141 320 -1.1227497 327 -0.9876491 334 -0.6929625 341 -0.5500139 348 -1.0542824 355 1.3528003 362 | 314 1.8132357 321 -0.5624641 328 1.4401607 335 1.7832167 342 2.0331066 349 -0.7719699 356 1.1815192 363 | 315 -0.6242130 322 -0.8813298 329 -0.9103878 336 1.0141427 343 -0.7150896 350 -0.8017815 357 -0.9927865 364 |

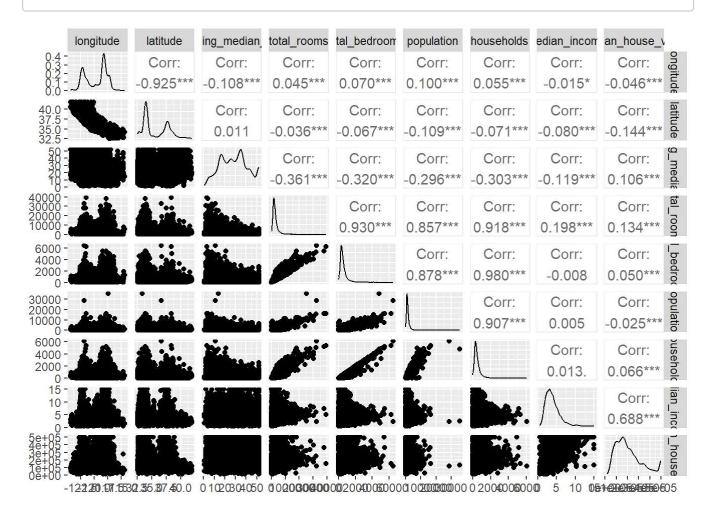
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                                   367
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                                                           369
                                                                       370
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                                                                            1.3563644
##
                                                                                   378
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           372
                       373
                                   374
                                               375
                                                           376
                                                                       377
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                1.3977248
                            1.1254057
                                       -1.0296109 -0.6441489
                                                               -1.0357179
                                                                            1.0279384
##
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##
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                                   381
                                               382
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##
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                                               389
                                                           390
                                                                       391
                                                                                   392
##
                       387
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##
   -0.9313432
                1.1294664
                                                                            1.1992439
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                                                                                   399
##
           393
                       394
                                   395
                                               396
                                                                       398
##
    1.7349045
                1.2836525
                            1.6569214 -1.1582228 -0.6015442 -0.6320556 -1.1162445
##
           400
## -0.8458358
```

## Assignment 4 exercises

#### Part 1

```
nocat_dat <- dat[,0:9]
# nocat_dat
```

ggpairs(nocat\_dat)



## Written answers

Write your answer here.