# W271 Spring 18: Lab 2

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## Alcohol Consumption, Self-Esteem and Romantic Interactions

#### Introduction

The researchers stated the hypothesis as follow: "We hypothesized that negative interactions with romantic partners would be associated with alcohol consumption (and an increased desire to drink). We predicted that people with low trait self-esteem would drink more on days they experienced more negative relationship interactions compared with days during which they experienced fewer negative relationship interactions. The relation between drinking and negative relationship interactions should not be evident for individuals with high trait self-esteem."

#### EDA

## numall

```
library(car); require(dplyr); library(Hmisc); library(mcprofile); library(ggplot2); library(gridExtra);
dehart <- read.table(file="DeHartSimplified.csv", header=TRUE, sep=",")</pre>
describe(dehart) #with a 10-page limit, should we include this type of output?
## dehart
##
                     623 Observations
   13 Variables
##
##
         n missing distinct
##
                                                             .05
                                 Info
                                         Mean
                                                    Gmd
                                                                      .10
##
       623
              0
                     89
                                  1
                                         75.89
                                                  56.82
                                                             7.0
                                                                     16.2
                         .75
        .25
                 .50
                                  .90
                                           .95
##
               60.0
                       123.0
                                147.2
##
      33.0
                                         153.0
##
           1 2 4 5 7, highest: 153 154 155 156 160
## lowest :
  studyday
##
         n missing distinct
                                 Info
                                          Mean
                                                    Gmd
##
       623
                                 0.98
                                                  2.289
##
                                  4
## Value
                 1
                       2
                            3
## Frequency
                89
                      89
                            89
                                  89
                                        89
## Proportion 0.143 0.143 0.143 0.143 0.143 0.143
## dayweek
##
         n missing distinct
                                 Info
                                          Mean
                                                    Gmd
                                 0.98
##
                  Ω
                                                  2.289
       623
##
## Value
                       2
                 1
                             3
                                         5
## Frequency
                89
                      89
                            89
                                  89
                                        89
## Proportion 0.143 0.143 0.143 0.143 0.143 0.143
```

```
n missing distinct Info Mean Gmd .05 622 1 18 0.97 2.524 2.636 0.00
##
                                               .10
##
                                   2.636 0.00
                                                0.00
     622
                 .75
                      .90 .95
##
     . 25
           .50
          2.00
              3.75
                       6.00 8.00
##
    1.00
##
          0 1 2 3
                           4 5
                                    6
                                        7 8
## Value
## Frequency 141 112 132 81 49 43
                                   24
## Proportion 0.227 0.180 0.212 0.130 0.079 0.069 0.039 0.010 0.014 0.011
##
## Value
                            14
                                        21
          10 11
                  12
                      13
                               15
                                   18
## Frequency
          7 4 2 1 1 1
                                    1
## Proportion 0.011 0.006 0.003 0.002 0.002 0.002 0.002 0.002
## -----
## nrel
     n missing distinct Info Mean Gmd
##
                                          .05
                                                .10
##
     623
        0 33
                      0.551
                             0.359
                                  0.6252
                                          0
                                                 0
     .25
##
           .50
                 .75 .90
                           .95
##
     0
            0
                  0
                        1
                              2
##
## lowest : 0.0000000 0.2000000 0.2500000 0.3333333 0.4000000
## highest: 5.0000000 5.5000000 5.8333333 6.0000000 9.0000000
## -----
## prel
     n missing distinct Info
                                   Gmd .05
                            Mean
##
                                              .10
        0 68 0.982 2.583 2.613 0.0000
##
     623
                                               0.0000
     .25
           .50
                 .75 .90 .95
##
  0.4167 2.0000 4.0000 6.0000 7.8683
## lowest : 0.0000000 0.2000000 0.2500000 0.3333333 0.5000000
## highest: 8.1666667 8.3333333 8.5000000 8.6666667 9.0000000
## -----
## negevent
     n missing distinct Info Mean Gmd .05
##
                                                 .10
        0 131 0.996 0.4414 0.4123 0.0000
                                               0.0000
##
     623
                 .75
##
     . 25
           .50
                      .90
                            .95
##
  0.1583   0.3500   0.6292   1.0000   1.1500
##
## lowest : 0.00000000 0.02500000 0.03333333 0.05000000 0.07500000
## highest: 1.70000000 1.93000000 1.95000000 2.01666667 2.37666667
## -----
## posevent
   n missing distinct Info Mean Gmd
##
                                          . 05
                                                 . 10
                      1 1.048 0.7077 0.200
.90 .95
        0 216
##
     623
                                               0.300
##
           .50
                .75
    . 25
   0.600
          0.950 1.378 1.938
                             2.200
##
## lowest : 0.00000000 0.04000000 0.05000000 0.06666667 0.10000000
## highest: 3.23333333 3.25000000 3.30000000 3.40000000 3.88333333
## -----
## gender
##
     n missing distinct Info Mean
                                    Gmd
     623 0 2 0.739
                            1.562 0.4932
##
##
## Value 1
```

```
## Frequency
              273
## Proportion 0.438 0.562
  ______
## rosn
         n missing distinct
##
                                Info
                                        Mean
                                                  Gmd
                                                           .05
                                                                    .10
                               0.993
##
       623
               0
                         17
                                        3.436
                                                0.4663
                                                           2.7
                                                                    2.9
                .50
##
       .25
                        .75
                                .90
                                          .95
##
       3.2
                3.5
                        3.8
                                 3.9
                                          4.0
##
                    2.4 2.5
                                            2.9
## Value
               2.1
                                2.7
                                      2.8
                                                 3.0
                                                       3.1
                                                             3.2
                                                                   3.3
## Frequency
                7
                      7
                           14
                                  7
                                       21
                                            35
                                                  42
                                                        21
                                                              28
                                                                    42
## Proportion 0.011 0.011 0.022 0.011 0.034 0.056 0.067 0.034 0.045 0.067
##
## Value
               3.4
                    3.5
                          3.6
                                3.7
                                      3.8
                                            3.9
                                                 4.0
## Frequency
               35
                    84 63
                               49
                                     63
                                           49
                                                  56
## Proportion 0.056 0.135 0.101 0.079 0.101 0.079 0.090
##
  age
##
                                                           .05
         n missing distinct
                                Info
                                        Mean
                                                  Gmd
                                                                    .10
##
       623
              0
                         89
                                 1
                                        34.29
                                                 5.18
                                                         26.24
                                                                  27.82
                        .75
##
       .25
                .50
                                 .90
                                          .95
              34.57
##
     30.53
                       38.19
                               40.15
                                        40.56
##
## lowest : 24.43258 25.57700 26.05613 26.14100 26.23682
## highest: 40.56400 40.58864 40.68720 40.82957 42.27789
## desired
                                                                    .10
##
         n missing distinct
                                Info
                                        Mean
                                                  Gmd
                                                           .05
##
                         22
                               0.996
                                        4.465
                                                1.921
       620
               3
                                                         1.333
                                                                  2.000
       .25
##
                .50
                        .75
                                 .90
                                          .95
##
     3.333
              4.667
                       5.667
                               6.667
                                        7.333
##
## lowest : 1.000000 1.333333 1.666667 2.000000 2.333333
## highest: 6.666667 7.000000 7.333333 7.666667 8.000000
##
## state
##
         n missing distinct
                               Info
                                        Mean
                                                  Gmd
                                                           .05
                                                                    .10
##
       620
                3
                         25
                               0.993
                                        3.966
                                                0.4894
                                                         3.222
                                                                  3.333
##
       .25
                .50
                         .75
                                 .90
                                          .95
              4.000
##
     3.667
                       4.222
                               4.556
                                        4.556
##
## lowest : 2.333333 2.444444 2.555556 2.666667 2.777778
## highest: 4.555556 4.666667 4.777778 4.888889 5.000000
```

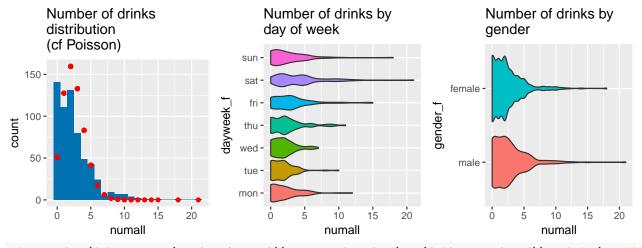
The dataset contains 623 observations of 13 variables representing entries in records kept by study participants. The variable **id** is a numeric identifier for each of the 89 study participants. Each participant recorded entries for seven consecutive days, indexed by the **studyday** variable, with the **dayweek** variable indicating which days of the week these correspond to (Monday = 1). The variable **gender** takes on one of two values according to whether the participant is male (1) or female (2); about 56% of the participants are female.

```
dehart$dayweek_f <- factor(dehart$dayweek); levels(dehart$dayweek_f) = c("mon", "tue", "wed", "thu", "fri",
dehart$gender_f <- factor(dehart$gender); levels(dehart$gender_f) = c("male", "female")</pre>
```

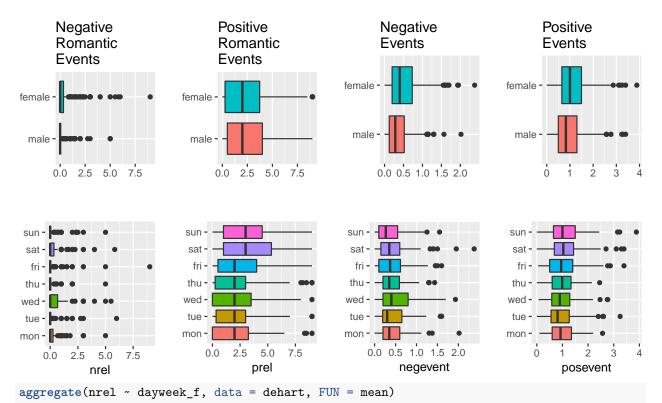
For each of the seven days, participants record the number of drinks consumed with the integer **numall** count variable. There is one missing value. Values range from 0 to 15 with single outliers at 19 and 21. Observations are concentrated in the range 0 to 5. The sample mean and sample variance are 2.52 and 2.66 respectively. The median number of drinks is 3 for Friday, 4 for Saturday and 2 for all other days. There is a pronounced positive skew to the number of drinks for Fridays, Saturdays and Sundays.

The variables **nrel** and **prel** are index measures for the negative and positive romantic-relationship events experienced by the subject each day (ranging from 0 to around 9), while **negevent** and **posevent** are index values combining the total number and intensity of negative and positive events experienced that day (ranging from 0 to around 4). There are no missing values for these variables. Distributions (and scales) for these measurements are very different, although tend to be similar for males and females, and similar across days of the week, although **prel** has signifiantly higher average (mean and median) values on Saturdays and Sundays. Distributions for all these variables are strongly positively-skewed, but this is particularly extreme for **nrel**, where a small fraction of outlying observations accounts for almost all of the variation.

```
#mean(dehart$numall, na.rm=TRUE); sd(dehart$numall, na.rm=TRUE)
#aggregate(numall ~ dayweek_f, data = dehart, FUN = function(x) c(m = mean(x), n = median(x)))
#The distribution of 622 times a Poisson random variable with parameter lambda is overlaid on the histo
lambda = 2.5
p1 <- ggplot(na.omit(dehart), aes(x = numall)) + geom_histogram(aes(y = ..count..), binwidth = 1, fill=
    geom_point(aes(y = 622*dpois(x = numall,lambda)), color = "red")+ ggtitle("Number of drinks\ndistribu)
p2<-ggplot(na.omit(dehart), aes(dayweek_f, numall)) + geom_violin(aes(fill = dayweek_f)) + ggtitle("Number of drinks\ndistribu)
p3<-ggplot(na.omit(dehart), aes(gender_f, numall)) + geom_violin(aes(fill = gender_f)) + ggtitle("Number of drinks\ndistribu)
grid.arrange(p1, p2, p3, ncol = 3)</pre>
```



p1a<-ggplot(dehart, aes(gender\_f, nrel)) + geom\_boxplot(aes(fill = gender\_f)) + labs(x = "", y = "") + p1b<-ggplot(dehart, aes(dayweek\_f, nrel)) + geom\_boxplot(aes(fill = dayweek\_f)) + labs(x = "") + ggtitl p2a<-ggplot(dehart, aes(gender\_f, prel)) + geom\_boxplot(aes(fill = gender\_f)) + labs(x = "", y = "") + p2b<-ggplot(dehart, aes(dayweek\_f, prel)) + geom\_boxplot(aes(fill = dayweek\_f)) + labs(x = "") + ggtitl p3a<-ggplot(dehart, aes(gender\_f, negevent)) + geom\_boxplot(aes(fill = gender\_f)) + labs(x = "", y = "" p3b<-ggplot(dehart, aes(dayweek\_f, negevent)) + geom\_boxplot(aes(fill = dayweek\_f)) + labs(x = "") + gg p4a<-ggplot(dehart, aes(gender\_f, posevent)) + geom\_boxplot(aes(fill = gender\_f)) + labs(x = "", y = "" p4b<-ggplot(dehart, aes(dayweek\_f, posevent)) + geom\_boxplot(aes(fill = dayweek\_f)) + labs(x = "") + gg grid.arrange(p1a, p2a, p3a, p4a, p1b, p2b, p3b, p4b, ncol = 4)



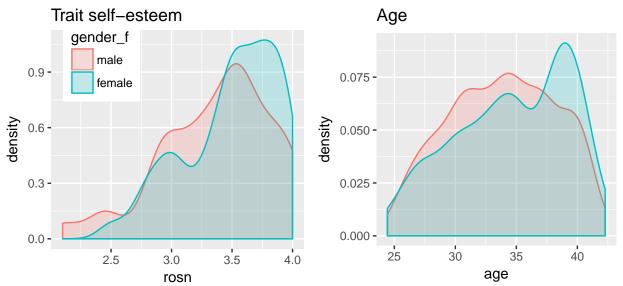
## dayweek\_f nrel ## 1 mon 0.3471910 ## 2 tue 0.2882022 ## 3 wed 0.5541466

## 4 thu 0.2295880 ## 5 fri 0.4014981

## 6 sat 0.4033708 ## 7 sun 0.2893258

The **rosn** variable measures trait (long-term) self-esteem, a single measurement for each participant taken at the beginning of the study that does not change over the course of the seven days. This measurement ranges between 2 and 4, with a mean value around 3.4. Distributions for males and females differ, with a larger proportion of males recording lower values and a larger proportion of females recording higher values. The **age** variable measures age in years, ranging between 24.4 and 42.3 with a mean value of 34.3 and similar distributions for males and females but with a higher proportion of females recording higher values. Neither **rosn** nor **age** have any missing observations.

```
quantile(dehart$rosn[dehart$gender == 1])
        25%
             50%
                  75% 100%
##
   2.1
        3.0
             3.5
                  3.7 4.0
quantile(dehart$rosn[dehart$gender == 2])
     0% 25% 50% 75% 100%
## 2.50 3.30 3.55 3.80 4.00
p1<-ggplot(dehart, aes(x = rosn, fill = gender_f, colour = gender_f)) + geom_density(alpha=0.2)+ ggtitl
p2<-ggplot(dehart, aes(x = age, fill = gender_f, colour = gender_f)) + geom_density(alpha=0.2)+
  ggtitle("Age")+theme(legend.position="none")
grid.arrange(p1, p2, ncol = 2)
```



The **desired** variable is a measure of the participant's recorded desire to drink, with values ranging between 1 and 8, a mean of 4.5 and a fairly symmetric distribution. with a significant share of responses at minimum and maximum values. Average values are slightly higher on average for males than for females and are highest on Friday and Saturday and lowest on Sunday and Monday. The **state** variable is a record of the participant's state (short-term) self-esteem as it varies each day. This ranges between 2 and 5 with a mean of 3.97 and a moderately negative-skewed distribution, little difference between males and females and little difference between days of the week (although with more negative outliers on Mondays). The variables **desired** and **state** both contain three missing values, two of these being from the same observation.

```
# aggregate(desired ~ gender_f, data = dehart, FUN = mean)
# aggregate(desired ~ dayweek_f, data = dehart, FUN = mean)
# aggregate(state ~ gender_f, data = dehart, FUN = mean)
# aggregate(state ~ dayweek_f, data = dehart, FUN = mean)
p1<-ggplot(na.omit(dehart), aes(gender_f, desired)) + geom_boxplot(aes(fill = gender_f)) + labs(x = "")
  ggtitle("Desire to\ndrink") + theme(legend.position="none") + coord_flip()
p2<-ggplot(na.omit(dehart), aes(dayweek_f, desired)) + geom_boxplot(aes(fill = dayweek_f)) + labs(x = "
  ggtitle("Desire to\ndrink") + theme(legend.position="none") + coord_flip()
p3<-ggplot(na.omit(dehart), aes(gender_f, state)) + geom_boxplot(aes(fill = gender_f)) + labs(x = "") +
  ggtitle("State\nSelf-Esteem") + theme(legend.position="none") + coord_flip()
p4<-ggplot(na.omit(dehart), aes(dayweek_f, state)) + geom_boxplot(aes(fill = dayweek_f)) + labs(x = "")
  ggtitle("State\nSelf-Esteem") + theme(legend.position="none") + coord_flip()
grid.arrange(p1, p2, p3, p4, ncol = 4)
     Desire to
                           Desire to
                                                     State
                                                                           State
     drink
                           drink
                                                     Self-Esteem
                                                                           Self-Esteem
                                                                        sun
                                                                        sat
female
                                                female
                                                                         fri
                                                                        thu
```

3

4

state

5

3

4

state

Bivarate relationships between these continuous variables are summarized in the below plot of correlation coefficients below. Most of these relationship are weak or insignificant. The strongest positive correlations

6

desired

ż

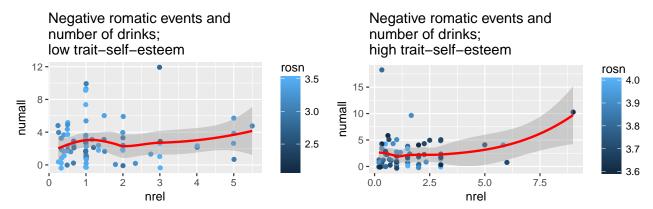
6 8

are between **nrel** and **negevent** (negative events and negative romantic events), and between **prel** and **posevent** (positive events and positive romantic events). There is also a moderate positive correlation between the number of drinks and the desire to drink (**numall** and **desired**), and a mild positive correlation between trait and state self-esteem (**rosn** and **state**). State self-esteem has a weak positive correlation to positive event variables and a weak negative correlation to negative event variables, but no correlation with the number of drinks nor the desire to drink. Trait self-esteem has a weak negative correlation with the desire to drink but no correlation with the number of drinks. Age is uncorrected with any other variable.

```
data \leftarrow na.omit(dehart[,c(4,5,6,7,8,10,11,12,13)])
corr <- round(cor(data), 2)</pre>
ggcorrplot(corr, p.mat = cor_pmat(data),hc.order = TRUE, type = "lower", color = c("#FC4E07", "white",
                                                                0.4
  numall
posevent
                                                        0.09
                                                               0.12
                                                        0.12
                                                               0.12
                                                 0.56
      prel
                                                                         Corr
                                                                              1.0
                                                 0)0(5
                                                         X
                                                                X
      age
                                                                              0.5
                                                                              0.0
                                                         X
                                                               0)(02
    state
                                                                              -0.5
                                                                              -1.0
     rosn
                           0.26
                                                                0.13
negevent
                    0.09
                                           X
                            -0.13
                                  0)\(0(4
      nrel
                                          <del>-0.21</del> –0.08
```

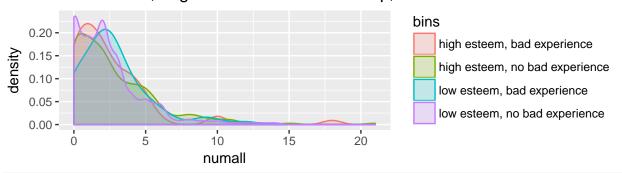
The heavily skewed distribution for **nrel** indicates that the negative romatic relationship events relevant to the hypothesis are relatively infrequent. A subset of the dataset can be created for participant-days involving a non-zero rating on this variable. The relationship between **nrel** and numall can then be compared for participants with below-median trait self-esteem and above-median trait self-esteem. The relationship between negative romatic relationship events and the number of drinks appears to be stronger for individuals with higher trait-self esteem, however the range of this is driven by a relatively small number of individuals recording high **nrel** values that do not appear in the lower trait-self-esteem subset.

```
dehart_nrel = dehart[which(dehart$nrel != 0),]
p1 <- ggplot(na.omit(dehart_nrel[which(dehart_nrel$rosn<=3.5),]), aes(nrel, numall)) + geom_jitter(aes(
p2 <- ggplot(na.omit(dehart_nrel[which(dehart_nrel$rosn>3.5),]), aes(nrel, numall)) + geom_jitter(aes(c grid.arrange(p1, p2,ncol = 2))
```



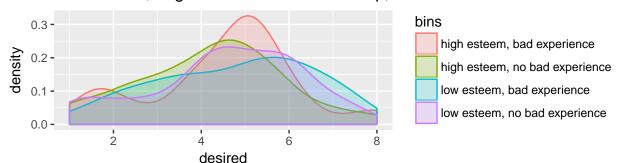
```
dehart$bins <- dehart$rosn
dehart$bins[dehart$rosn <= median(dehart$rosn) & dehart$nrel <= median(dehart$nrel)] = "low esteem, no dehart$bins[dehart$rosn <= median(dehart$rosn) & dehart$nrel > median(dehart$nrel)] = "low esteem, bad dehart$bins[dehart$rosn > median(dehart$rosn) & dehart$nrel <= median(dehart$nrel)] = "high esteem, no dehart$bins[dehart$rosn > median(dehart$rosn) & dehart$nrel > median(dehart$nrel)] = "high esteem, bad dehart$bins[dehart$rosn > median(dehart$rosn) & dehart$nrel > median(dehart$nrel)] = "high esteem, bad dehart$pins[dehart], aes(numall, fill = bins, colour = bins)) +
    geom_density(alpha=0.2) +
    ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative density(alpha=0.2) +
    ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks") + ggtitle("Self esteem, negative romantic relationship, number of drinks
```

## Self esteem, negative romantic relationship, number of drinks

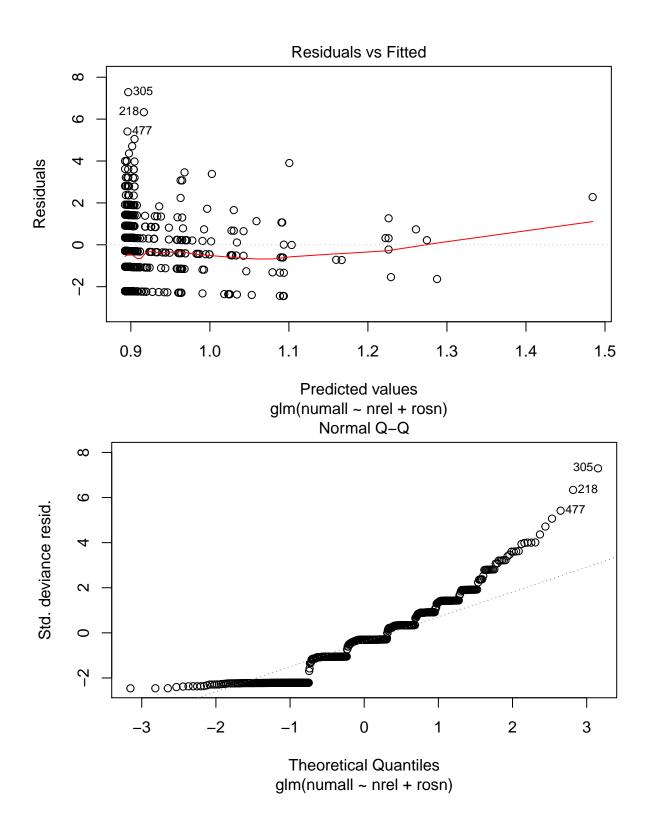


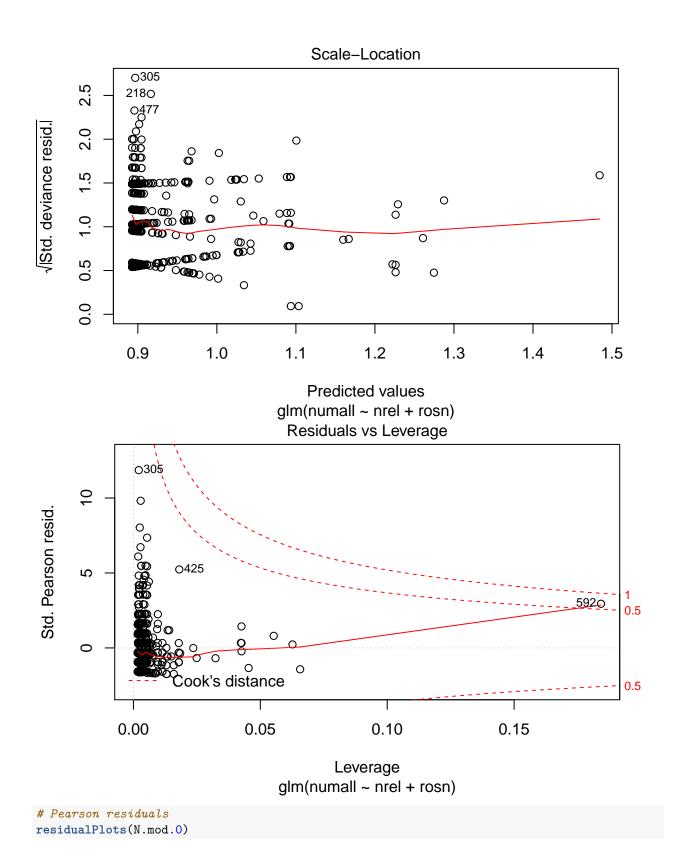
## Self esteem, negative romantic relationship, desire to drink

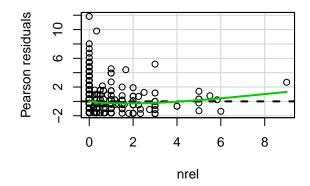
p2

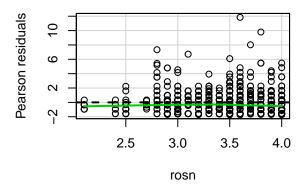


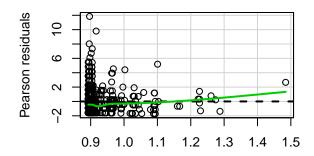
```
# NUMBER OF DRINKS; POISSON MODEL
# significant interaction effect
# BASIC MODEL
N.mod.0 <- glm(formula = numall ~ nrel + rosn, family = poisson(link = "log"), data = na.omit(dehart))
summary(N.mod.0)
##
## Call:
## glm(formula = numall ~ nrel + rosn, family = poisson(link = "log"),
##
      data = na.omit(dehart))
##
## Deviance Residuals:
##
      Min
                1Q
                    Median
                                 3Q
                                        Max
## -2.4434 -1.1434 -0.3040 0.3448
                                     7.2878
## Coefficients:
##
              Estimate Std. Error z value Pr(>|z|)
## (Intercept) 0.932497 0.209136 4.459 8.24e-06 ***
## nrel
              0.065298
                         0.023671 2.759 0.00581 **
              ## rosn
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for poisson family taken to be 1)
##
      Null deviance: 1583.5 on 617 degrees of freedom
## Residual deviance: 1576.5 on 615 degrees of freedom
## AIC: 2944.5
## Number of Fisher Scoring iterations: 5
# hypothesis tests for statistical significance
Anova(N.mod.0, test = "LR")
## Analysis of Deviance Table (Type II tests)
##
## Response: numall
       LR Chisq Df Pr(>Chisq)
## nrel 6.9884 1
                    0.008204 **
       0.0270 1
                    0.869573
## rosn
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# diagnostic plots
plot(N.mod.0)
```







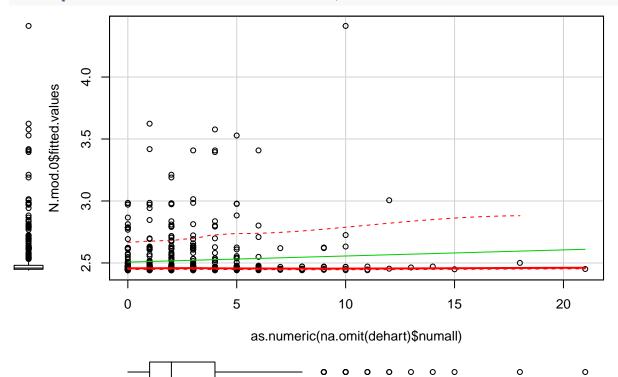




**Linear Predictor** 

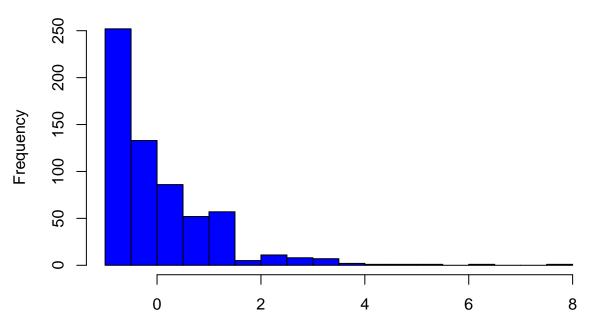
## Test stat Pr(>|t|)
## nrel 7.028 0.008
## rosn 2.364 0.124

# scatterplot of actual and fitted values
scatterplot(as.numeric(na.omit(dehart)\$numall), N.mod.0\$fitted.values)



```
# histogram of residuals
hist(N.mod.0$residuals, breaks = 20, col = "blue")
```

## Histogram of N.mod.0\$residuals



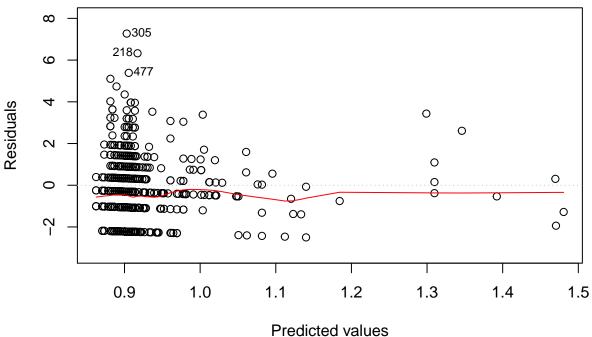
N.mod.0\$residuals

```
N.mod.1 \leftarrow glm(formula = numall \sim nrel + rosn + nrel*rosn, family = poisson(link = "log"), data = na.om summary(N.mod.1)
```

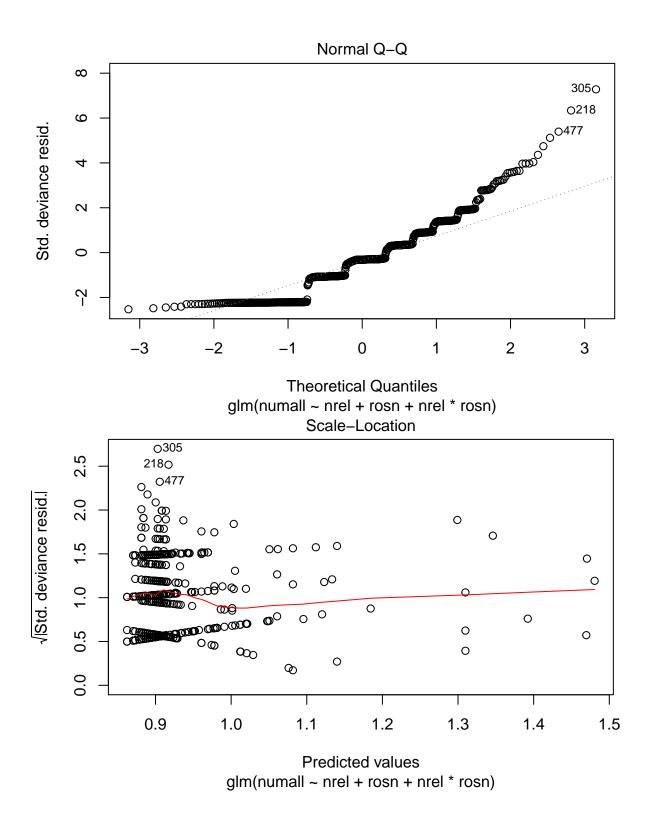
```
##
## Call:
## glm(formula = numall ~ nrel + rosn + nrel * rosn, family = poisson(link = "log"),
      data = na.omit(dehart))
##
## Deviance Residuals:
      Min
                1Q
                     Median
                                  3Q
                                          Max
## -2.5007 -1.0966 -0.3156
                              0.3795
                                       7.2719
## Coefficients:
              Estimate Std. Error z value Pr(>|z|)
                                   3.598 0.00032 ***
## (Intercept) 0.80573
                          0.22392
               0.45430
                          0.23218
                                    1.957 0.05039 .
                                    0.417 0.67682
## rosn
               0.02700
                          0.06477
## nrel:rosn
              -0.11252
                          0.06722 -1.674 0.09416 .
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for poisson family taken to be 1)
##
##
      Null deviance: 1583.5 on 617 degrees of freedom
## Residual deviance: 1573.8 on 614 degrees of freedom
## AIC: 2943.7
##
```

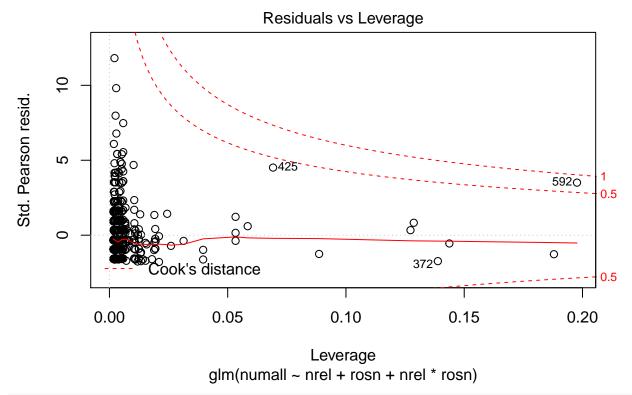
```
## Number of Fisher Scoring iterations: 5
# hypothesis tests for statistical significance
Anova(N.mod.1, test = "LR")
## Analysis of Deviance Table (Type II tests)
## Response: numall
##
            LR Chisq Df Pr(>Chisq)
              6.9884 1
                          0.008204 **
## nrel
## rosn
              0.0270
                          0.869573
              2.7409
                          0.097809
## nrel:rosn
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# diagnostic plots
plot(N.mod.1)
```

#### Residuals vs Fitted

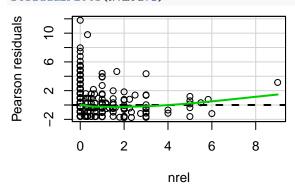


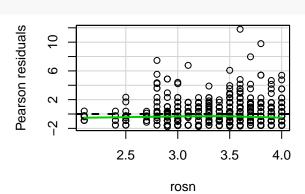
Predicted values
glm(numall ~ nrel + rosn + nrel \* rosn)

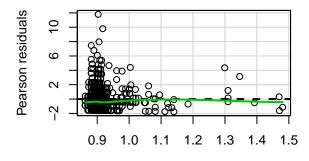






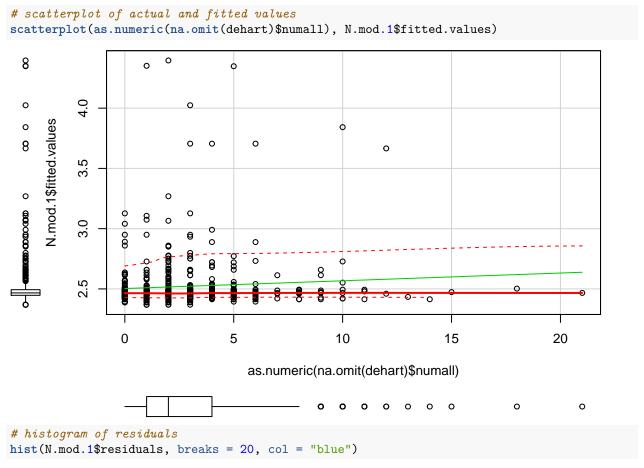




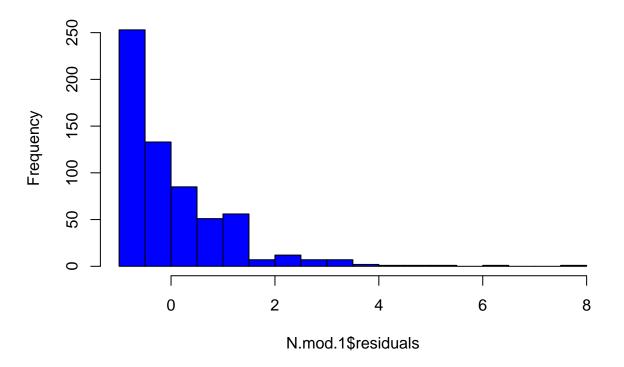


#### **Linear Predictor**

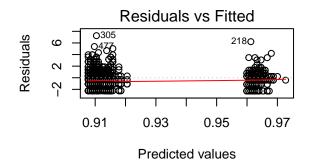
## Test stat Pr(>|t|)
## nrel 8.826 0.003
## rosn 1.934 0.164

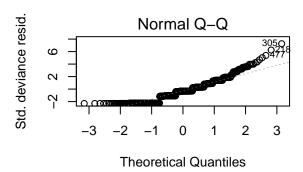


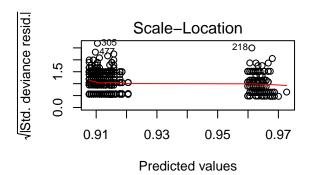
# Histogram of N.mod.1\$residuals

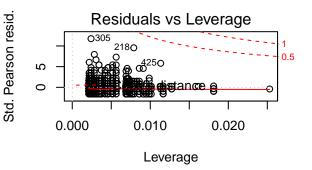


```
# AGAIN WITH FACTOR FOR NREL
dehart$nrel_f <- dehart$nrel</pre>
dehart$nrel f[dehart$nrel f != 0] = 1
dehart$nrel_f <- factor(dehart$nrel_f)</pre>
levels(dehart$nrel_f) <- c("low", "high")</pre>
N.mod.Oa <- glm(formula = numall ~ nrel_f + rosn, family = poisson(link = "log"), data = na.omit(dehart
summary(N.mod.0a)
##
## Call:
## glm(formula = numall ~ nrel_f + rosn, family = poisson(link = "log"),
       data = na.omit(dehart))
##
## Deviance Residuals:
       Min
            1Q Median
                                   3Q
                                          Max
## -2.2939 -1.1442 -0.3229 0.6693
                                       7.2528
##
## Coefficients:
               Estimate Std. Error z value Pr(>|z|)
## (Intercept) 0.934688 0.208906 4.474 7.67e-06 ***
                          0.059103 0.883
## nrel fhigh 0.052194
                                              0.377
## rosn
              -0.006743 0.060503 -0.111
                                              0.911
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for poisson family taken to be 1)
##
##
       Null deviance: 1583.5 on 617 degrees of freedom
## Residual deviance: 1582.8 on 615 degrees of freedom
## AIC: 2950.7
##
## Number of Fisher Scoring iterations: 5
# hypothesis tests for statistical significance
Anova(N.mod.0a, test = "LR")
## Analysis of Deviance Table (Type II tests)
##
## Response: numall
         LR Chisq Df Pr(>Chisq)
## nrel_f 0.77295 1
                         0.3793
## rosn
          0.01241 1
                         0.9113
# diagnostic plots
par(mfrow=c(2,2))
plot(N.mod.0a)
```

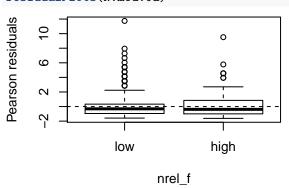


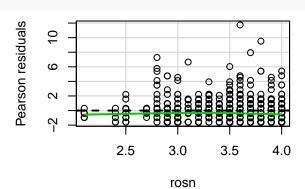


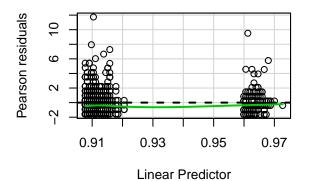


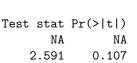


# Pearson residuals residualPlots(N.mod.0a)









2.591

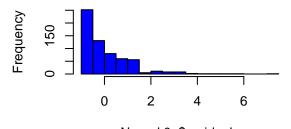
## nrel\_f

## rosn

```
# scatterplot of actual and fitted values
scatterplot(as.numeric(na.omit(dehart)$numall), N.mod.Oa$fitted.values)
          2.65
                          8
                                                                           0
          2.60
     N.mod.0a$fitted.values
          2.55
          2.50
                0
                                 5
                                                 10
                                                                 15
                                                                                  20
                                   as.numeric(na.omit(dehart)$numall)
                                                                                     0
# histogram of residuals
hist(N.mod.Oa$residuals, breaks = 20, col = "blue")
N.mod.1a <- glm(formula = numall ~ nrel_f + rosn + nrel_f*rosn, family = poisson(link = "log"), data = :
summary(N.mod.1a)
##
## Call:
## glm(formula = numall ~ nrel_f + rosn + nrel_f * rosn, family = poisson(link = "log"),
##
       data = na.omit(dehart))
##
## Deviance Residuals:
       Min
                 1Q
##
                      Median
                                    3Q
                                             Max
##
  -2.4504 -1.1137 -0.3339
                                0.5868
                                          7.2275
##
## Coefficients:
##
                    Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                     0.74179
                                0.23394
                                           3.171 0.00152 **
                     1.06068
                                           2.021
## nrel_fhigh
                                0.52477
                                                  0.04326 *
                     0.04959
                                0.06768
                                           0.733
                                                  0.46375
## rosn
## nrel_fhigh:rosn -0.29204
                                0.15154
                                         -1.927 0.05397 .
##
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for poisson family taken to be 1)
##
```

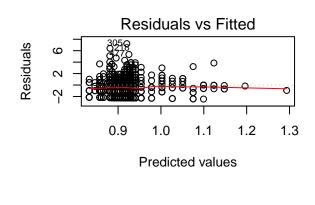
```
Null deviance: 1583.5 on 617 degrees of freedom
## Residual deviance: 1579.1 on 614 degrees of freedom
## AIC: 2949
##
## Number of Fisher Scoring iterations: 5
# hypothesis tests for statistical significance
Anova(N.mod.1a, test = "LR")
## Analysis of Deviance Table (Type II tests)
## Response: numall
##
              LR Chisq Df Pr(>Chisq)
## nrel_f
                0.7729 1
                             0.37931
                             0.91129
## rosn
                0.0124 1
## nrel_f:rosn
                3.6538 1
                             0.05594 .
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# diagnostic plots
par(mfrow=c(2,2))
```

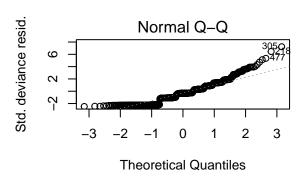
## Histogram of N.mod.0a\$residuals

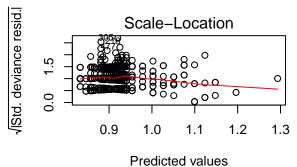


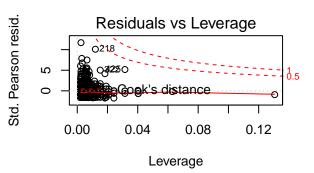
N.mod.0a\$residuals

plot(N.mod.1a)



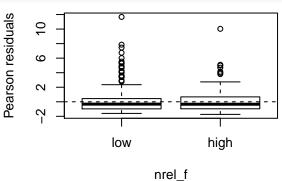


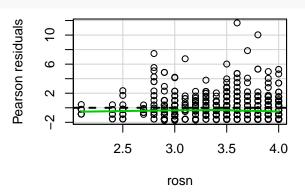


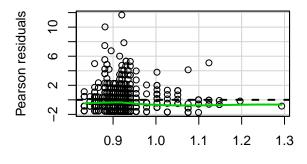


Fredicted value

# Pearson residuals
residualPlots(N.mod.1a)





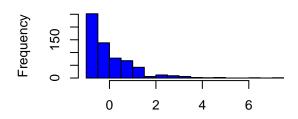


**Linear Predictor** 

## Test stat Pr(>|t|)
## nrel\_f NA NA
## rosn 2.118 0.146

```
# scatterplot of actual and fitted values
scatterplot(as.numeric(na.omit(dehart)$numall), N.mod.1a$fitted.values)
 0
           3.4
     N.mod.1a$fitted.values
                             0
           3.2
                             0
                             0
                                                             0
           3.0
                             0
           2.8
           2.6
           2.4
                  0
                                    5
                                                     10
                                                                       15
                                                                                         20
                                       as.numeric(na.omit(dehart)$numall)
# histogram of residuals
hist(N.mod.1a$residuals, breaks = 20, col = "blue")
# little significance for anything
```

### Histogram of N.mod.1a\$residuals



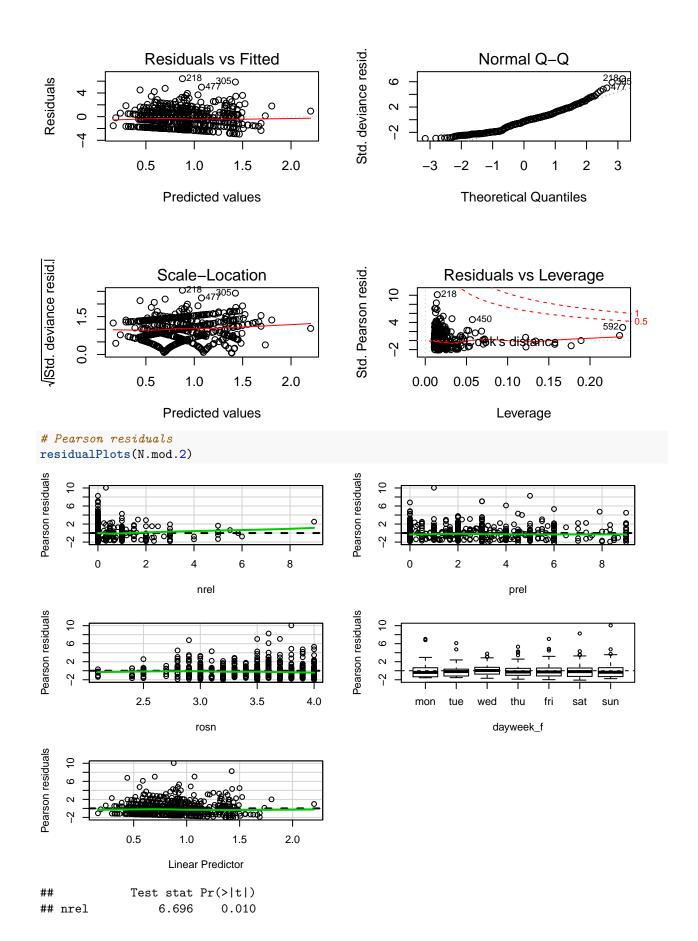
```
N.mod.1a$residuals
# INTERMEDIATE MODEL; DAYS OF THE WEEK

N.mod.2 <- glm(formula = numall ~ nrel + prel + rosn + nrel*rosn + prel*rosn + dayweek_f, family = pois
summary(N.mod.2)

##
## Call:
## glm(formula = numall ~ nrel + prel + rosn + nrel * rosn + prel *</pre>
```

rosn + dayweek\_f, family = poisson(link = "log"), data = na.omit(dehart))

```
##
## Deviance Residuals:
      Min
                1Q
                    Median
                                         Max
## -2.9432 -1.5586 -0.2800 0.5938
                                      6.4240
## Coefficients:
               Estimate Std. Error z value Pr(>|z|)
                           0.35651 -0.900 0.368296
## (Intercept) -0.32074
                                   3.164 0.001556 **
## nrel
                0.75464
                           0.23851
## prel
                0.26556
                          0.07484
                                  3.549 0.000387 ***
                                   2.577 0.009955 **
## rosn
                0.26221
                           0.10174
## dayweek_ftue -0.14614
                           0.11041 -1.324 0.185635
## dayweek_fwed -0.09892
                          0.10809 -0.915 0.360100
## dayweek_fthu 0.19492
                          0.10104
                                   1.929 0.053711 .
## dayweek_ffri 0.36276
                           0.09749
                                  3.721 0.000199 ***
## dayweek_fsat 0.66487
                           0.09225
                                   7.207 5.7e-13 ***
                           0.10180
                                   1.776 0.075714 .
## dayweek_fsun 0.18081
## nrel:rosn
              -0.19302
                           0.06875 -2.808 0.004991 **
## prel:rosn
               -0.06616
                           0.02216 -2.986 0.002830 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for poisson family taken to be 1)
##
      Null deviance: 1583.5 on 617 degrees of freedom
## Residual deviance: 1416.1 on 606 degrees of freedom
## AIC: 2802
## Number of Fisher Scoring iterations: 5
# hypothesis tests for statistical significance
Anova(N.mod.2, test = "LR")
## Analysis of Deviance Table (Type II tests)
## Response: numall
            LR Chisq Df Pr(>Chisq)
              10.510 1
## nrel
                          0.001187 **
## prel
              16.789 1 4.178e-05 ***
               0.089 1
## rosn
                         0.765921
## dayweek f 116.305 6 < 2.2e-16 ***
              7.642 1
                          0.005702 **
## nrel:rosn
## prel:rosn
               8.807 1
                          0.003000 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# diagnostic plots
par(mfrow=c(2,2))
plot(N.mod.2)
```



```
## prel
                  0.000
                            0.996
                            0.090
## rosn
                  2.867
## dayweek f
                     NA
                               NA
# scatterplot of actual and fitted values
scatterplot(as.numeric(na.omit(dehart)$numall), N.mod.2$fitted.values)
  0
                                                         0
          \infty
     N.mod.2$fitted.values
 0 000000
          9
                           0
                                                                0
                           8
                                                                             0
                 0
                                  5
                                                  10
                                                                   15
                                                                                   20
                                    as.numeric(na.omit(dehart)$numall)
                                                                                       0
# histogram of residuals
hist(N.mod.2$residuals, breaks = 20, col = "blue")
# AGAIN WITH FACTOR FOR NREL
N.mod.2a <- glm(formula = numall ~ nrel + prel + rosn + nrel*rosn + prel*rosn + dayweek_f, family = poi
summary(N.mod.2a)
##
## Call:
## glm(formula = numall ~ nrel + prel + rosn + nrel * rosn + prel *
       rosn + dayweek_f, family = poisson(link = "log"), data = na.omit(dehart))
##
##
## Deviance Residuals:
##
       Min
                  1Q
                       Median
                                     3Q
                                              Max
## -2.9432 -1.5586 -0.2800
                                 0.5938
                                           6.4240
##
## Coefficients:
                 Estimate Std. Error z value Pr(>|z|)
                              0.35651 -0.900 0.368296
## (Intercept) -0.32074
## nrel
                  0.75464
                              0.23851
                                        3.164 0.001556 **
```

0.11041 -1.324 0.185635

3.549 0.000387 \*\*\*

2.577 0.009955 \*\*

## prel

## rosn

0.26556

0.26221

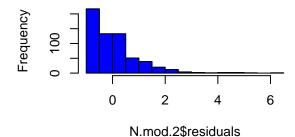
## dayweek\_ftue -0.14614

0.07484

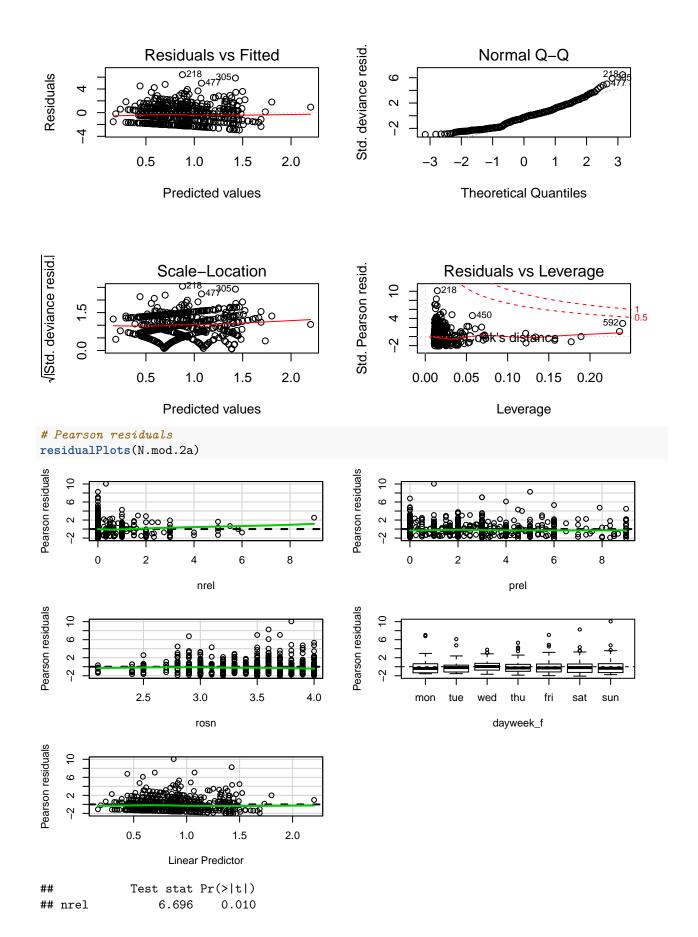
0.10174

```
0.10809 -0.915 0.360100
## dayweek_fwed -0.09892
## dayweek_fthu 0.19492
                           0.10104
                                    1.929 0.053711 .
## dayweek ffri 0.36276
                           0.09749
                                     3.721 0.000199 ***
                                     7.207 5.7e-13 ***
## dayweek_fsat 0.66487
                           0.09225
## dayweek_fsun 0.18081
                           0.10180
                                     1.776 0.075714 .
## nrel:rosn
                           0.06875 -2.808 0.004991 **
               -0.19302
## prel:rosn
               -0.06616
                           0.02216 -2.986 0.002830 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for poisson family taken to be 1)
##
##
      Null deviance: 1583.5 on 617 degrees of freedom
## Residual deviance: 1416.1 on 606 degrees of freedom
## AIC: 2802
##
## Number of Fisher Scoring iterations: 5
# hypothesis tests for statistical significance
Anova(N.mod.2a, test = "LR")
## Analysis of Deviance Table (Type II tests)
##
## Response: numall
##
            LR Chisq Df Pr(>Chisq)
## nrel
              10.510 1
                          0.001187 **
              16.789 1
                         4.178e-05 ***
## prel
               0.089 1
                          0.765921
## rosn
## dayweek_f 116.305 6
                        < 2.2e-16 ***
## nrel:rosn
               7.642 1
                          0.005702 **
## prel:rosn
               8.807
                     1
                          0.003000 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# diagnostic plots
par(mfrow=c(2,2))
```

## Histogram of N.mod.2\$residuals

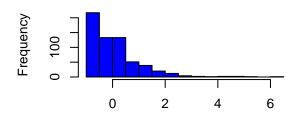


plot(N.mod.2a)



```
## prel
                   0.000
                              0.996
## rosn
                   2.867
                              0.090
## dayweek_f
                       NA
                                 NA
# scatterplot of actual and fitted values
scatterplot(as.numeric(na.omit(dehart)$numall), N.mod.2a$fitted.values)
  0
                                                              0
           \infty
     N.mod.2a$fitted.values
 000000
           9
                             0
                                                                     0
                             8
                                                                                   0
                  0
                                    5
                                                      10
                                                                        15
                                                                                          20
                                       as.numeric(na.omit(dehart)$numall)
                                                                                   0
                                                                                              0
# histogram of residuals
hist(N.mod.2a$residuals, breaks = 20, col = "blue")
```

## Histogram of N.mod.2a\$residuals

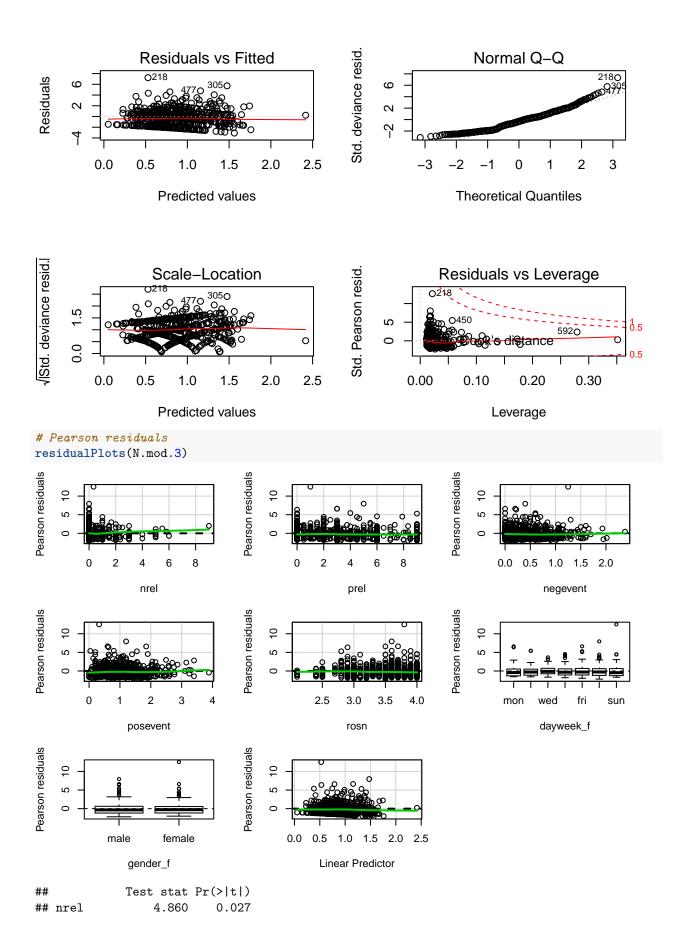


##

N.mod.2a\$residuals

```
# EVERYTHING MODEL
N.mod.3 <- glm(formula = numall ~ nrel + prel + negevent + posevent + rosn + nrel*rosn + prel*rosn + da
summary(N.mod.3)
##
## Call:
## glm(formula = numall ~ nrel + prel + negevent + posevent + rosn +
##
       nrel * rosn + prel * rosn + dayweek_f + gender_f, family = poisson(link = "log"),
       data = na.omit(dehart))
```

```
##
## Deviance Residuals:
      Min
                1Q
                     Median
                                          Max
## -3.0888 -1.5326 -0.3009 0.5579
                                       7.2406
## Coefficients:
                 Estimate Std. Error z value Pr(>|z|)
                             0.35862 -0.529 0.596697
## (Intercept)
                 -0.18977
## nrel
                  0.67296
                             0.24626
                                       2.733 0.006282 **
## prel
                  0.23071
                             0.07679
                                       3.004 0.002660 **
## negevent
                 -0.28695
                             0.07873 -3.645 0.000268 ***
## posevent
                             0.04553
                                       1.256 0.209197
                  0.05717
## rosn
                  0.25820
                             0.10247
                                       2.520 0.011742 *
## dayweek_ftue
                             0.11041 -1.278 0.201401
                 -0.14105
## dayweek_fwed
                 -0.06779
                             0.10818 -0.627 0.530885
## dayweek_fthu
                  0.20608
                             0.10109
                                       2.039 0.041491 *
                             0.09750
                                       3.652 0.000260 ***
## dayweek_ffri
                  0.35610
## dayweek fsat
                  0.65559
                             0.09222
                                       7.109 1.17e-12 ***
## dayweek_fsun
                  0.15534
                             0.10198
                                       1.523 0.127684
## gender ffemale -0.12184
                             0.05287 -2.304 0.021200 *
## nrel:rosn
                 -0.15359
                             0.07125 -2.156 0.031108 *
## prel:rosn
                 -0.05709
                             0.02252 -2.535 0.011243 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for poisson family taken to be 1)
##
      Null deviance: 1583.5 on 617 degrees of freedom
## Residual deviance: 1393.9 on 603 degrees of freedom
## AIC: 2785.9
##
## Number of Fisher Scoring iterations: 5
# hypothesis tests for statistical significance
Anova(N.mod.3, test = "LR")
## Analysis of Deviance Table (Type II tests)
##
## Response: numall
##
            LR Chisq Df Pr(>Chisq)
## nrel
             23.990 1 9.684e-07 ***
               8.845 1
                          0.002938 **
## prel
## negevent
              13.739 1
                          0.000210 ***
## posevent
               1.558 1
                          0.211933
## rosn
               0.152 1
                          0.696398
## dayweek_f 109.411 6
                         < 2.2e-16 ***
## gender_f
               5.302 1
                          0.021296 *
## nrel:rosn
               4.527 1
                          0.033371 *
## prel:rosn
               6.355 1
                          0.011707 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# diagnostic plots
par(mfrow=c(2,2))
plot(N.mod.3)
```



```
## prel
                  0.086
                           0.769
                           0.510
## negevent
                  0.434
## posevent
                           0.242
                  1.369
## rosn
                  1.595
                           0.207
## dayweek_f
                     NA
                              NA
## gender_f
                     NA
                              NA
# scatterplot of actual and fitted values
scatterplot(as.numeric(na.omit(dehart)$numall), N.mod.3$fitted.values)
 0
                                                         0
          10
     N.mod.3$fitted.values
          \infty
          9
                                                                             0
                0
                                 5
                                                 10
                                                                  15
                                                                                   20
                                    as.numeric(na.omit(dehart)$numall)
                                                                                      0
# histogram of residuals
hist(N.mod.3$residuals, breaks = 20, col = "blue")
# AGAIN WITH FACTOR FOR NREL
N.mod.3a <- glm(formula = numall ~ nrel_f + prel + negevent + posevent + rosn + nrel_f*rosn + prel*rosn
summary(N.mod.3a)
##
## Call:
  glm(formula = numall ~ nrel_f + prel + negevent + posevent +
       rosn + nrel_f * rosn + prel * rosn + dayweek_f + gender_f,
##
       family = poisson(link = "log"), data = na.omit(dehart))
##
## Deviance Residuals:
       Min
                       Median
                  1Q
                                     30
                                             Max
## -3.0351 -1.4924 -0.3336
                                          6.8959
                                 0.5733
##
## Coefficients:
```

0.36850 -0.801 0.42285

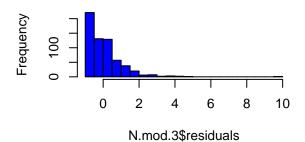
Estimate Std. Error z value Pr(>|z|)

-0.29535

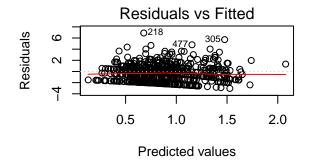
## (Intercept)

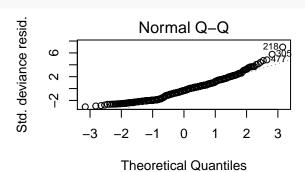
```
## nrel_fhigh
                   1.27887
                              0.54581
                                        2.343 0.01913 *
## prel
                              0.07676
                                      3.119 0.00181 **
                   0.23940
## negevent
                  -0.18588
                              0.07493 -2.481 0.01311 *
                                       1.358 0.17441
## posevent
                   0.06225
                              0.04583
## rosn
                   0.28017
                              0.10473
                                       2.675 0.00747 **
## dayweek ftue
                              0.11070 -1.194 0.23254
                  -0.13216
## dayweek fwed
                  -0.05320
                              0.10803 -0.492 0.62240
                                       2.130 0.03317 *
## dayweek_fthu
                   0.21604
                              0.10143
                                        3.899 9.66e-05 ***
## dayweek_ffri
                   0.38033
                              0.09755
## dayweek_fsat
                   0.67713
                              0.09217
                                       7.347 2.03e-13 ***
## dayweek_fsun
                   0.17687
                              0.10213
                                       1.732 0.08329 .
## gender_ffemale -0.12023
                              0.05294 -2.271 0.02313 *
## nrel_fhigh:rosn -0.32065
                              0.15819 -2.027 0.04266 *
## prel:rosn
                              0.02250 -2.744 0.00606 **
                  -0.06174
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for poisson family taken to be 1)
##
##
      Null deviance: 1583.5 on 617 degrees of freedom
## Residual deviance: 1411.2 on 603 degrees of freedom
## AIC: 2803.1
##
## Number of Fisher Scoring iterations: 5
# hypothesis tests for statistical significance
Anova(N.mod.3a, test = "LR")
## Analysis of Deviance Table (Type II tests)
## Response: numall
##
              LR Chisq Df Pr(>Chisq)
## nrel_f
                 7.187 1
                            0.007344 **
                 5.871 1
                            0.015388 *
## prel
                 6.308 1
## negevent
                            0.012018 *
## posevent
                 1.820 1
                            0.177352
## rosn
                 0.101 1
                            0.751226
## dayweek_f
               114.269 6 < 2.2e-16 ***
## gender_f
                 5.151 1
                            0.023234 *
## nrel f:rosn
                 4.044 1
                            0.044319 *
## prel:rosn
                 7.444 1
                            0.006364 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# diagnostic plots
par(mfrow=c(2,2))
```

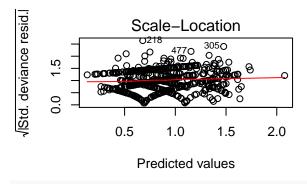
## Histogram of N.mod.3\$residuals

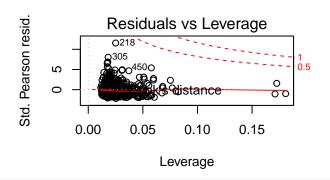


plot(N.mod.3a)

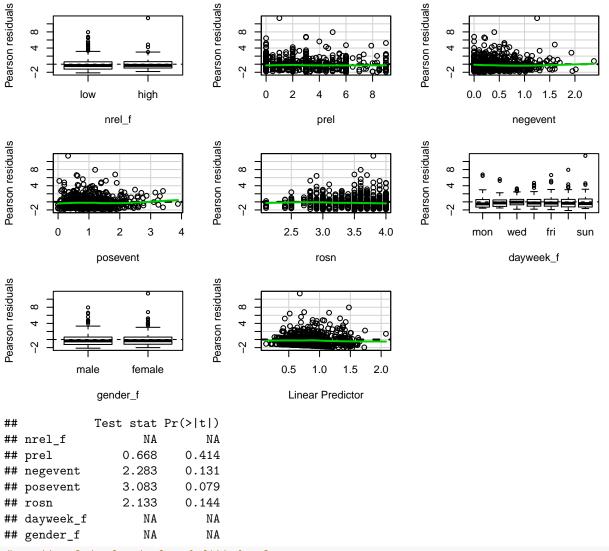




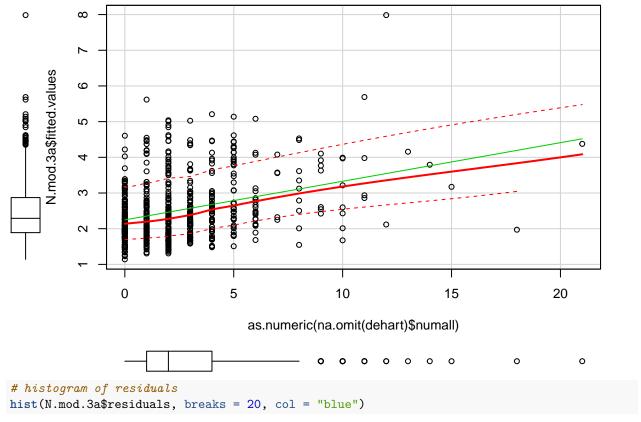




# Pearson residuals
residualPlots(N.mod.3a)

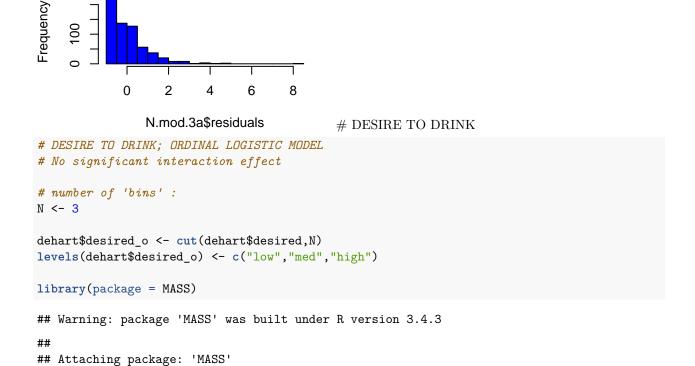


# scatterplot of actual and fitted values
scatterplot(as.numeric(na.omit(dehart)\$numall), N.mod.3a\$fitted.values)



#### Histogram of N.mod.3a\$residuals

## The following object is masked from 'package:dplyr':



```
##
##
      select
# BASIC MODEL
D.mod.0 <- polr(formula = desired_o ~ nrel + rosn, method = "logistic", data = na.omit(dehart))</pre>
summary(D.mod.0)
##
## Re-fitting to get Hessian
## Call:
## polr(formula = desired_o ~ nrel + rosn, data = na.omit(dehart),
      method = "logistic")
## Coefficients:
##
         Value Std. Error t value
## nrel 0.2327 0.0842 2.763
## rosn -0.6614
                  0.1820 -3.633
## Intercepts:
           Value Std. Error t value
## low|med -3.2555 0.6391
                              -5.0940
## med|high -1.2734 0.6258
                              -2.0347
## Residual Deviance: 1301.456
## AIC: 1309.456
# hypothesis tests for statistical significance
Anova(D.mod.0, test = "LR")
## Analysis of Deviance Table (Type II tests)
## Response: desired_o
       LR Chisq Df Pr(>Chisq)
## nrel
        7.9511 1 0.0048058 **
## rosn 13.4152 1 0.0002496 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
D.mod.1 <- polr(formula = desired_o ~ nrel + rosn + nrel*rosn, method = "logistic", data = na.omit(deha
summary(D.mod.1)
##
## Re-fitting to get Hessian
## polr(formula = desired_o ~ nrel + rosn + nrel * rosn, data = na.omit(dehart),
      method = "logistic")
##
##
## Coefficients:
##
              Value Std. Error t value
                     0.8564 0.8518
## nrel
             0.7295
## rosn
            -0.6242
                        0.1925 -3.2418
                     0.2448 -0.5838
## nrel:rosn -0.1429
## Intercepts:
```

```
Value Std. Error t value
## low|med -3.1279 0.6741
                             -4.6401
## med|high -1.1457 0.6619
##
## Residual Deviance: 1301.11
## AIC: 1311.11
# hypothesis tests for statistical significance
Anova(D.mod.1, test = "LR")
## Analysis of Deviance Table (Type II tests)
## Response: desired_o
           LR Chisq Df Pr(>Chisq)
## nrel
              7.9511 1 0.0048058 **
             13.4152 1 0.0002496 ***
## rosn
## nrel:rosn 0.3467 1 0.5559720
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# factors for nrel
D.mod.0a <- polr(formula = desired_o ~ nrel_f + rosn, method = "logistic", data = na.omit(dehart))</pre>
summary(D.mod.0a)
##
## Re-fitting to get Hessian
## polr(formula = desired_o ~ nrel_f + rosn, data = na.omit(dehart),
      method = "logistic")
##
##
## Coefficients:
               Value Std. Error t value
## nrel_fhigh 0.2042
                       0.1776 1.149
                         0.1822 -3.588
## rosn
            -0.6536
##
## Intercepts:
           Value Std. Error t value
## low|med -3.2532 0.6387
                              -5.0933
## med|high -1.2863 0.6256
                              -2.0562
## Residual Deviance: 1308.084
## AIC: 1316.084
# hypothesis tests for statistical significance
Anova(D.mod.0a, test = "LR")
## Analysis of Deviance Table (Type II tests)
##
## Response: desired_o
         LR Chisq Df Pr(>Chisq)
## nrel f 1.3231 1 0.2500292
          13.0747 1 0.0002993 ***
## rosn
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

```
D.mod.1a <- polr(formula = desired_o ~ nrel_f + rosn + nrel_f*rosn, method = "logistic", data = na.omit
summary(D.mod.1a)
##
## Re-fitting to get Hessian
## polr(formula = desired_o ~ nrel_f + rosn + nrel_f * rosn, data = na.omit(dehart),
       method = "logistic")
##
## Coefficients:
##
                    Value Std. Error t value
## nrel_fhigh
                   1.9635
                             1.6524
                                      1.188
                              0.2006 -2.804
## rosn
                   -0.5624
## nrel_fhigh:rosn -0.5057
                              0.4720 - 1.071
##
## Intercepts:
##
            Value Std. Error t value
                               -4.2058
## low|med -2.9419 0.6995
## med|high -0.9726 0.6889
                               -1.4118
## Residual Deviance: 1306.926
## AIC: 1316.926
# hypothesis tests for statistical significance
Anova(D.mod.1a, test = "LR")
## Analysis of Deviance Table (Type II tests)
## Response: desired_o
##
              LR Chisq Df Pr(>Chisq)
## nrel_f
                1.3231 1 0.2500292
                13.0747 1 0.0002993 ***
## rosn
## nrel_f:rosn 1.1583 1 0.2818095
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# INTERMEDIATE MODEL; DAYS OF THE WEEK
D.mod.2 <- polr(formula = desired_o ~ nrel + prel + rosn + nrel*rosn + prel*rosn + dayweek_f, method =
summary(D.mod.2)
##
## Re-fitting to get Hessian
## polr(formula = desired_o ~ nrel + prel + rosn + nrel * rosn +
       prel * rosn + dayweek_f, data = na.omit(dehart), method = "logistic")
##
##
## Coefficients:
##
                   Value Std. Error t value
## nrel
                 1.04024
                           0.88741 1.1722
## prel
                0.40201
                           0.25436 1.5805
## rosn
               -0.41787
                           0.28431 -1.4698
## dayweek_ftue 0.17013
                           0.28610 0.5947
## dayweek_fwed 0.24405
                           0.28909 0.8442
```

```
## dayweek_fthu 0.43213
                           0.29240 1.4779
## dayweek_ffri 0.58517
                           0.28812 2.0310
## dayweek_fsat 0.72353
                           0.29169 2.4804
## dayweek_fsun -0.36303
                           0.29268 -1.2404
## nrel:rosn
              -0.21341
                           0.25329 -0.8425
               -0.08328
                           0.07412 -1.1237
## prel:rosn
## Intercepts:
##
           Value
                   Std. Error t value
## low|med -1.8847 0.9971
                              -1.8901
## med|high 0.1882 0.9927
                               0.1896
## Residual Deviance: 1265.545
## AIC: 1291.545
# hypothesis tests for statistical significance
Anova(D.mod.2, test = "LR")
## Analysis of Deviance Table (Type II tests)
## Response: desired_o
            LR Chisq Df Pr(>Chisq)
             11.8245 1 0.0005846 ***
## nrel
             12.9135 1 0.0003262 ***
## prel
## rosn
             14.5145 1 0.0001391 ***
## dayweek_f 19.7301 6 0.0030929 **
             0.7236 1 0.3949748
## nrel:rosn
## prel:rosn
             1.2785 1 0.2581742
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# AGAIN WITH FACTOR FOR NREL
D.mod.2a <- polr(formula = desired_o ~ nrel + prel + rosn + nrel*rosn + prel*rosn + dayweek_f, method =
summary(D.mod.2a)
##
## Re-fitting to get Hessian
## polr(formula = desired_o ~ nrel + prel + rosn + nrel * rosn +
      prel * rosn + dayweek_f, data = na.omit(dehart), method = "logistic")
##
## Coefficients:
##
                  Value Std. Error t value
## nrel
                1.04024
                          0.88741 1.1722
                           0.25436 1.5805
## prel
                0.40201
## rosn
               -0.41787
                           0.28431 -1.4698
## dayweek_ftue 0.17013
                           0.28610 0.5947
## dayweek_fwed 0.24405
                           0.28909 0.8442
## dayweek_fthu 0.43213
                           0.29240 1.4779
## dayweek_ffri 0.58517
                           0.28812 2.0310
## dayweek fsat 0.72353
                           0.29169 2.4804
## dayweek_fsun -0.36303
                           0.29268 -1.2404
## nrel:rosn
             -0.21341
                           0.25329 -0.8425
## prel:rosn -0.08328
                          0.07412 -1.1237
```

##

```
## Intercepts:
##
           Value Std. Error t value
                              -1.8901
## low|med -1.8847 0.9971
## med|high 0.1882 0.9927
                               0.1896
## Residual Deviance: 1265.545
## AIC: 1291.545
# hypothesis tests for statistical significance
Anova(D.mod.2a, test = "LR")
## Analysis of Deviance Table (Type II tests)
## Response: desired_o
##
            LR Chisq Df Pr(>Chisq)
## nrel
             11.8245 1 0.0005846 ***
## prel
             12.9135 1 0.0003262 ***
## rosn
             14.5145 1 0.0001391 ***
## dayweek_f 19.7301 6 0.0030929 **
## nrel:rosn
             0.7236 1 0.3949748
## prel:rosn
             1.2785 1 0.2581742
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# EVERYTHING MODEL
D.mod.3 <- polr(formula = desired_o ~ nrel + prel + negevent + posevent + rosn + nrel*rosn + prel*rosn
summary(D.mod.3)
##
## Re-fitting to get Hessian
## Call:
## polr(formula = desired_o ~ nrel + prel + negevent + posevent +
      rosn + nrel * rosn + prel * rosn + dayweek_f + gender_f,
##
##
      data = na.omit(dehart), method = "logistic")
##
## Coefficients:
##
                    Value Std. Error t value
## nrel
                 1.06457
                            0.89038 1.1956
## prel
                  0.36682
                             0.25715 1.4265
## negevent
                 0.07835
                             0.23000 0.3406
## posevent
                  0.29010
                             0.14827 1.9565
## rosn
                 -0.38060
                             0.28738 -1.3244
## dayweek_ftue
                0.17462
                             0.28700 0.6085
## dayweek_fwed
                             0.29036 0.8052
                  0.23381
## dayweek_fthu
                0.44950
                             0.29310 1.5336
## dayweek_ffri
                0.57864
                             0.28920 2.0008
## dayweek_fsat
                  0.73233
                             0.29259 2.5029
## dayweek_fsun
                -0.36900
                             0.29467 -1.2522
## gender_ffemale -0.37536
                             0.16101 -2.3313
## nrel:rosn
                 -0.21804
                             0.25446 - 0.8569
## prel:rosn
                 -0.08630
                             0.07465 -1.1561
##
## Intercepts:
##
           Value Std. Error t value
```

```
## low|med -1.7482 1.0062
                              -1.7375
## med|high 0.3456 1.0024
                               0.3448
## Residual Deviance: 1257.573
## AIC: 1289.573
# hypothesis tests for statistical significance
Anova(D.mod.3, test = "LR")
## Analysis of Deviance Table (Type II tests)
## Response: desired_o
##
            LR Chisq Df Pr(>Chisq)
## nrel
              9.8935 1 0.0016586 **
## prel
              3.3432 1 0.0674818 .
## negevent
              0.1161 1 0.7332954
              3.8755 1 0.0489964 *
## posevent
## rosn
             12.8532 1 0.0003369 ***
## dayweek_f 19.9499 6 0.0028268 **
## gender f
              5.4631 1 0.0194223 *
## nrel:rosn
             0.7440 1 0.3883749
## prel:rosn
              1.3545 1 0.2444937
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
# AGAIN WITH FACTOR FOR NREL
D.mod.3a <- polr(formula = desired_o ~ nrel_f + prel + negevent + posevent + rosn + nrel_f*rosn + prel*
summary(D.mod.3a)
##
## Re-fitting to get Hessian
## Call:
## polr(formula = desired_o ~ nrel_f + prel + negevent + posevent +
      rosn + nrel_f * rosn + prel * rosn + dayweek_f + gender_f,
##
      data = na.omit(dehart), method = "logistic")
##
## Coefficients:
                     Value Std. Error t value
                               1.7146 1.3860
## nrel fhigh
                   2.37635
## prel
                   0.37847
                               0.2555 1.4811
## negevent
                   0.31361
                               0.2197 1.4276
## posevent
                   0.27271
                               0.1475 1.8492
## rosn
                               0.2917 -1.0791
                  -0.31480
## dayweek_ftue
                   0.19285
                               0.2878 0.6702
## dayweek_fwed
                   0.26519
                               0.2904 0.9132
## dayweek_fthu
                   0.45382
                               0.2936 1.5457
## dayweek_ffri
                   0.61483
                               0.2894 2.1248
## dayweek_fsat
                   0.75681
                               0.2923 2.5889
## dayweek_fsun
                  -0.33017
                               0.2954 -1.1178
## gender_ffemale -0.36240
                               0.1610 -2.2515
## nrel fhigh:rosn -0.61124
                               0.4895 - 1.2486
## prel:rosn
                  -0.09397
                               0.0742 -1.2665
##
## Intercepts:
                   Std. Error t value
```

Value

```
## low|med -1.4866 1.0214
                            -1.4555
## med|high 0.5897 1.0189
                             0.5788
##
## Residual Deviance: 1265.037
## AIC: 1297.037
# hypothesis tests for statistical significance
Anova(D.mod.3a, test = "LR")
## Analysis of Deviance Table (Type II tests)
## Response: desired_o
             LR Chisq Df Pr(>Chisq)
##
## nrel_f
              1.6008 1 0.2057878
              2.1860 1 0.1392746
## prel
## negevent
             2.0408 1 0.1531332
              3.4588 1 0.0629154 .
## posevent
## rosn
              13.1261 1 0.0002912 ***
## dayweek_f 19.9268 6 0.0028537 **
              5.0941 1 0.0240073 *
## gender_f
## nrel_f:rosn 1.5731 1 0.2097587
## prel:rosn
               1.6256 1 0.2023108
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```