## Fitting Various Models in R

```
In [1]: library(data.table)
        library(MASS)
        library(VGAM)
        ichs.data <- data.table(read.table('ichs.txt'))</pre>
        head(ichs.data)
        Loading required package: stats4
        Loading required package: splines
             id gender height cosv sinv xero baseage age infect
         121013
                    0
                         -3
                                   0
                                        0
                                                         0
                              -1
                                              31
                                                  31
         121013
                         -3
                              0
                                  -1
                                              31
                                                  34
         121013
                    0
                         -2
                              1
                                   0
                                       0
                                                         0
                                              31
                                                  37
         121013
                         -2
                              0
                                   1
                                       0
                                                  40
                                                         0
                                              31
         121013
                         -2
                              -1
                                              31
         121013
                    O
                         -3
                              0
                                 -1
                                       0
                                                         0
                                              31
                                                  46
In [2]: bernoulli.model <- glm(infect ~ 1, data=ichs.data, family = quasibinomial)</pre>
        summary(bernoulli.model)
        Call:
        glm(formula = infect ~ 1, family = quasibinomial, data = ichs.data)
        Deviance Residuals:
                       1Q
                          Median
                                                  Max
        -0.4322 -0.4322 -0.4322 -0.4322
                                               2.1987
        Coefficients:
                    Estimate Std. Error t value Pr(>|t|)
        (Intercept) -2.3239 0.1013 -22.93 <2e-16 ***
        Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
        (Dispersion parameter for quasibinomial family taken to be 1.000834)
            Null deviance: 721.45 on 1199 degrees of freedom
        Residual deviance: 721.45 on 1199 degrees of freedom
        AIC: NA
        Number of Fisher Scoring iterations: 5
```

```
In [3]: binomial.model <- glm(</pre>
            cbind(infect, n - infect) ~ 1, family = quasibinomial,
            data=ichs.data[,list(n=length(infect), infect=sum(infect)),by=.(id)])
        summary(binomial.model)
        Call:
        glm(formula = cbind(infect, n - infect) ~ 1, family = quasibinomial,
            data = ichs.data[, list(n = length(infect), infect = sum(infect)),
               by = .(id)])
        Deviance Residuals:
                    1Q Median
                                      3Q
                                               Max
        -1.0587 -1.0587 -0.7486 0.6014 4.3975
        Coefficients:
                   Estimate Std. Error t value Pr(>|t|)
        (Intercept) -2.3239 0.1175 -19.77 <2e-16 ***
        Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
        (Dispersion parameter for quasibinomial family taken to be 1.346287)
            Null deviance: 312.47 on 274 degrees of freedom
        Residual deviance: 312.47 on 274 degrees of freedom
        AIC: NA
```

Number of Fisher Scoring iterations: 5

```
In [4]: beta.binomial.model <- vglm(</pre>
            cbind(infect, n - infect) ~ 1, family = betabinomial,
            data=ichs.data[,list(n=length(infect), infect=sum(infect)),by=.(id)])
        summary(beta.binomial.model)
        Warning message in checkwz(wz, M, trace = trace, wzepsilon = control$wzepsilon):
        "22 diagonal elements of the working weights variable 'wz' have been replaced by
        1.819e-12"Warning message in checkwz(wz, M = M, trace = trace, wzepsilon = contro
        1$wzepsilon):
        "22 diagonal elements of the working weights variable 'wz' have been replaced by
        1.819e-12"Warning message in checkwz(wz, M = M, trace = trace, wzepsilon = contro
        "22 diagonal elements of the working weights variable 'wz' have been replaced by
        1.819e-12"
        Call:
        vglm(formula = cbind(infect, n - infect) ~ 1, family = betabinomial,
            data = ichs.data[, list(n = length(infect), infect = sum(infect)),
                by = .(id)])
        Pearson residuals:
                                   1Q Median
                                                  3Q
        logit(mu) -0.7131 -7.131e-01 -0.5279 0.8009 4.098
        logit(rho) -1.2916 2.847e-11 0.1347 0.2801 11.956
        Coefficients:
                      Estimate Std. Error z value Pr(>|z|)
                                   0.1159 -19.95 < 2e-16 ***
        (Intercept):1 -2.3117
                                          -5.76 8.4e-09 ***
        (Intercept):2 -2.4126
                                   0.4188
        Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
        Number of linear predictors: 2
        Names of linear predictors: logit(mu), logit(rho)
        Log-likelihood: -221.2778 on 548 degrees of freedom
        Number of iterations: 3
```

Warning: Hauck-Donner effect detected in the following estimate(s):

'(Intercept):2'

```
In [5]: binomial.model <- glm(</pre>
           cbind(infect, n - infect) ~ 1 + baseage, family = quasibinomial,
           data=ichs.data[,list(n=length(infect), infect=sum(infect), baseage=mean(baseag
       e)),by=.(id)])
       summary(binomial.model)
       Call:
       glm(formula = cbind(infect, n - infect) ~ 1 + baseage, family = quasibinomial,
           data = ichs.data[, list(n = length(infect), infect = sum(infect),
               baseage = mean(baseage)), by = .(id)])
       Deviance Residuals:
           Min 10 Median
                                      3Q
                                             Max
       -1.4390 \quad -0.8773 \quad -0.5940 \quad 0.3292
                                          4.1245
       Coefficients:
                   Estimate Std. Error t value Pr(>|t|)
       -0.027499
                              0.006375 -4.314 2.25e-05 ***
       baseage
       Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
       (Dispersion parameter for quasibinomial family taken to be 1.196207)
           Null deviance: 312.47 on 274 degrees of freedom
       Residual deviance: 287.74 on 273 degrees of freedom
       AIC: NA
```

Number of Fisher Scoring iterations: 5

```
In [6]: beta.binomial.model <- vglm(</pre>
            cbind(infect, n - infect) ~ 1 + baseage, family = betabinomial,
            data=ichs.data[,list(n=length(infect), infect=sum(infect), baseage=mean(baseag
        e)),by=.(id)])
        summary(beta.binomial.model)
        Warning message in checkwz(wz, M, trace = trace, wzepsilon = control$wzepsilon):
        "22 diagonal elements of the working weights variable 'wz' have been replaced by
        1.819e-12"Warning message in checkwz(wz, M = M, trace = trace, wzepsilon = contro
        1$wzepsilon):
        "22 diagonal elements of the working weights variable 'wz' have been replaced by
        1.819e-12"Warning message in checkwz(wz, M = M, trace = trace, wzepsilon = contro
        1$wzepsilon):
        "22 diagonal elements of the working weights variable 'wz' have been replaced by
        1.819e-12"Warning message in checkwz(wz, M = M, trace = trace, wzepsilon = contro
        1$wzepsilon):
        "22 diagonal elements of the working weights variable 'wz' have been replaced by
        1.819e-12"Warning message in checkwz(wz, M = M, trace = trace, wzepsilon = contro
        1$wzepsilon):
        "22 diagonal elements of the working weights variable 'wz' have been replaced by
        1.819e-12"Warning message in checkwz(wz, M = M, trace = trace, wzepsilon = contro
        1$wzepsilon):
        "22 diagonal elements of the working weights variable 'wz' have been replaced by
        1.819e-12"Warning message in matrix.power(wz, M = M, power = 0.5, fast = TRUE):
        "Some weight matrices have negative eigenvalues. They will be assigned NAs"Warnin
        g message in matrix.power(wz, M = M, power = 0.5, fast = TRUE):
        "Some weight matrices have negative eigenvalues. They will be assigned NAs"
        vglm(formula = cbind(infect, n - infect) ~ 1 + baseage, family = betabinomial,
            data = ichs.data[, list(n = length(infect), infect = sum(infect),
               baseage = mean(baseage)), by = .(id)])
        Coefficients:
                      Estimate Std. Error z value Pr(>|z|)
        (Intercept):1 -2.520914  0.135098 -18.660 < 2e-16 ***
        (Intercept):2 -2.707920 0.507098 -5.340 9.29e-08 ***
                     baseage
        Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
        Number of linear predictors: 2
        Names of linear predictors: logit(mu), logit(rho)
        Log-likelihood: -211.5263 on 547 degrees of freedom
        Number of iterations: 6
        Warning: Hauck-Donner effect detected in the following estimate(s):
```

'(Intercept):1', '(Intercept):2'