```
> #Multiple Logistic Regression in R
> if (FALSE)
+ {"
+ The data, taken from Lee (1974), consist of patient characteristics and
+ whether or not cancer remission occurred, and are saved in the data set
+ Remission. The variable remiss is the cancer remission indicator variable
+ with a value of 1 for remission and a value of 0 for nonremission.
+ six variables are the risk factors thought to be related to cancer remission.
+ "}
> library(faraway)
> #read in the data which is in a csv file
> remission <- read.csv("C:/Users/jmard/OneDrive/Desktop/RegressionMethodsSpring2020/</pre>
                           Lecture 12 14APR2020/remission.csv", header = TRUE)
> head(remission,3L)
  remiss cell smear infil li blast temp
      1 0.8 0.83 0.66 1.9 1.100 0.996
1
2
       1 0.9 0.36 0.32 1.4 0.740 0.992
       0 0.8 0.88 0.70 0.8 0.176 0.982
3
> logistic <- glm(remiss ~ cell + smear + infil + li + blast + temp,family=binomial(logit),data=remission)</pre>
> summary(logistic)
Call:
glm(formula = remiss ~ cell + smear + infil + li + blast + temp,
    family = binomial(logit), data = remission)
Deviance Residuals:
     Min
                10
                     Median
                                    30
                                            Max
-1.95165 -0.66491 -0.04372
                               0.74304
                                         1.67069
Coefficients:
            Estimate Std. Error z value Pr(>|z|)
(Intercept) 58.0385
                        71.2364
                                  0.815
                                         0.4152
cell
             24.6615 47.8377 0.516
                                         0.6062
smear
            19.2936 57.9500
                                0.333 0.7392
infil
           -19.6013
                        61.6815 -0.318
                                         0.7507
li
              3.8960
                       2.3371
                                 1.667
                                          0.0955 .
```

```
blast
             0.1511
                      2.2786 0.066 0.9471
           -87.4339
                       67.5735 -1.294 0.1957
temp
___
Signif. codes: 0 \***' 0.001 \**' 0.01 \*' 0.05 \.' 0.1 \ ' 1
(Dispersion parameter for binomial family taken to be 1)
   Null deviance: 34.372 on 26 degrees of freedom
Residual deviance: 21.751 on 20 degrees of freedom
AIC: 35.751
Number of Fisher Scoring iterations: 8
> anova(logistic, test="Chisq")
Analysis of Deviance Table
Model: binomial, link: logit
Response: remiss
Terms added sequentially (first to last)
     Df Deviance Resid. Df Resid. Dev Pr(>Chi)
NULL
                        26
                              34.372
cell
          2.5800
                        25
      1
                              31.792 0.108223
smear 1 0.5188
                        24 31.273 0.471347
infil 1 0.2927
                        23 30.980 0.588500
li
      1 6.7818
                        22
                             24.199 0.009209 **
                        21
blast 1 0.3215
                              23.877 0.570724
      1 2.1264
                        20
                              21.751 0.144782
temp
___
Signif. codes: 0 \***' 0.001 \**' 0.01 \*' 0.05 \.' 0.1 \ ' 1
>
> library(DescTools) #install package if needed
> PseudoR2(logistic,which="all")
McFadden
            McFaddenAdj
                              CoxSnell
                                            Nagelkerke
                                                        AldrichNelson
            -0.04011686
0.36719420
                             0.37340108
                                            0.51859997
                                                           0.31854514
```

```
VeallZimmermann
                   Efron
                                 McKelveyZavoina
0.56877141
                 0.38771143
                                     0.83061406
   AIC
                   BIC
                                   logLik
                                                  logLik0
                                                                       G2
                44.82151035
                                -10.87532614
                                                -17.18588254
                                                                 12,62111280
35.75065229
                                                                 Null deviance: 34.372
>
                                                                  Residual deviance: 21.751
> if (FALSE)
+ {"
                                                                  34.372 - 21.751 = 12.621
+ McFadden pseudo-R2
+ McFadden adjusted pseudo-R2
+ Cox and Snell pseudo-R2 (also known as ML pseudo-R2)
+ Nagelkerke pseudoR2 (also known as CraggUhler R2)
+ AldrichNelson AldrichNelson pseudo-R2
+ VeallZimmermann pseudo-R2
+ McKelvey and Zavoina pseudo-R2
+ Efron pseudo-R2
+ Tiur's pseudo-R2
+ Akaike's information criterion
+ log-Likelihood for the fitted model (by maximum likelihood)
+ log-Likelihood for the null model. The null model will include the offset,
  and an intercept if there is one in the model.
+ G2 - difference of the null deviance - model deviance
+ "}
> remission2_7 <-cbind(remission$cell,remission$smear,remission$infil,remission$li,</pre>
          remission$blast,remission$temp)
> HosmerLemeshowTest(fit = fitted(logistic), obs = remission[,1], X = remission2 7)
$C
        Hosmer-Lemeshow C statistic
data: fitted(logistic) and remission[, 1]
X-squared = 10.69, df = 8, p-value = 0.2199
```

Hosmer-Lemeshow H statistic

>

```
data: fitted(logistic) and remission[, 1]
X-squared = 12.839, df = 8, p-value = 0.1175

$gof

le Cessie-van Houwelingen-Copas-Hosmer global goodness of fit test

data: fitted(logistic) and remission[, 1]
z = 0.13535, p-value = 0.8923
```