## Homework 4

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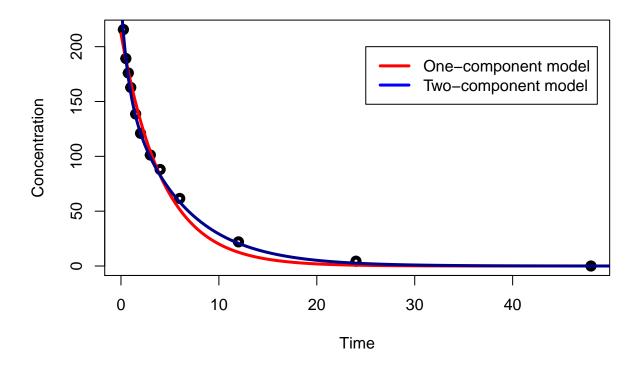
#### Problem J-2.3:

(a)

```
data = read.table('http://mathfaculty.fullerton.edu/mori/data/math534/serum_conc.txt', header=TRUE)
attach(data)
model <- function(alpha_1, lambda_1, alpha_2, lambda_2, t){</pre>
 E_1 = \exp(-lambda_1*t)
 E 2 = \exp(-lambda 2*t)
 f = alpha_1*E_1 + alpha_2*E_2 + exp(1)
 grad = cbind(E_1, -alpha_1*t*E_1, E_2, -alpha_2*t*E_2)
 attr(f,'gradient') <- grad</pre>
 return(f)
}
Result = nls(Concentration ~ model(alpha_1, lambda_1, alpha_2, lambda_2, Time),
            start=list(alpha_1=100, lambda_1=0.02, alpha_2=200, lambda_2=0.05), trace = TRUE,
            nls.control(maxiter = 50, tol = 1e-5, minFactor = 1/1024, printEval=TRUE))
## Warning in min(x): no non-missing arguments to min; returning Inf
## Warning in max(x): no non-missing arguments to max; returning -Inf
## 231329.2 : 1e+02 2e-02 2e+02 5e-02
                                                         0.4667008
## 165322 :
             3649.2381888
                              0.4007787 -3400.0114242
## 3638.549 :
              384.3248817
                              0.3681203 -136.8087595
                                                       0.4861802
## 2860.741 : 223.6343815   0.3269572   23.1456850
                                                  0.4911771
## 2722.359 : 236.5027530 0.2902003
                                      8.9183250
                                                   1.1011997
## 2543.661 : 227.0596711  0.2789450  17.8750132
                                                   0.8591281
## 1868.352 : 210.9306596  0.2588181  33.2112609
                                                   0.9181446
## 942.6622 : 190.7676906  0.2289185  52.1856133
                                                   1.0299582
1.203755
## 45.25495 : 163.667019
                           0.170934 78.092532
                                                1.397188
## 44.52444 : 164.4062140  0.1727339  77.4877186
                                                   1.3935490
## 44.52417 : 164.3565437
                            0.1726581 77.5274507
                                                   1.3923631
## 44.52417 : 164.3651625
                            0.1726686 77.5231205
                                                   1.3926456
## 44.52417 : 164.3634247
                            0.1726666 77.5239309
                                                   1.3925867
## 44.52417 : 164.363781
                           0.172667 77.523766
                                               1.392599
summary(Result)
##
## Formula: Concentration ~ model(alpha_1, lambda_1, alpha_2, lambda_2, Time)
```

```
## Parameters:
##
            Estimate Std. Error t value Pr(>|t|)
## alpha 1 164.36378
                        7.99697
                                 20.553 3.29e-08 ***
                                 16.339 1.98e-07 ***
## lambda_1
             0.17267
                         0.01057
## alpha_2
            77.52377
                         7.02524
                                 11.035 4.05e-06 ***
## lambda 2
             1.39260
                         0.25861
                                  5.385 0.000658 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 2.359 on 8 degrees of freedom
## Number of iterations to convergence: 14
## Achieved convergence tolerance: 3.455e-06
(b)
plot(Time, Concentration, lwd=4, main='Plot of the data and the fitted curves')
t = seq(0,50, 0.1)
lines(t, 211.9203*exp(-0.2357*t), col='red', lwd=3)
lines(t, 164.3638*exp(-0.1727*t) + 77.5238*exp(-1.3926*t), col = 'darkblue', lwd=3)
legend(25, 200, c("One-component model", "Two-component model"),col=c("red", "blue"), lty=1, lwd=3)
```

### Plot of the data and the fitted curves



The two component model does seem to fit better the data than the one component model.

### Problem J-2.4:

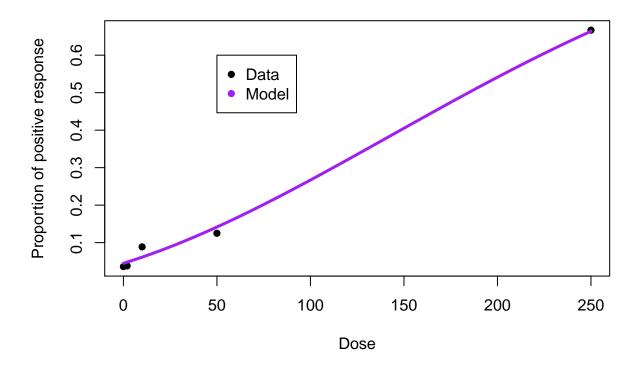
(a)

```
data = read.table('C:/Users/Louis/Documents/UPMC/M1/Spring 2018/MATH 534/Homework 4/data_j-2.4.txt', he
attach(data)
X = as.matrix(cbind(Dose, Number_tested))
y = as.matrix(Tumor_incidence)
beta_0=c(0.1,.001,1e-5)
maxit = 30
tolgrad = 1e-9; tolerr = 1e-6
#converged solution used to compute the convergence ratio
beta_star = c(4.5945e-02, 1.6271e-03, 1.0192e-05)
MLE_beta = GN(y, X, beta_0, list_f_Jac_W_bin, Wt = 1, maxit, IRLS = TRUE, tolgrad, tolerr, beta_star)
##
##
                                                                  ||grad||
    it
             beta_0
                                beta 1
                                                  beta_2
                                                                                 MRE
                                                                                         CV ratio
          0.100000000000
                             0.001000000000
                                                0.000010000000
                                                                   3.4e + 05
##
     1
                                                                               5.4e-02
                                                                                          4.0e+00
##
     2
                             0.001434258033
                                                0.000010906535
                                                                   1.9e+04
                                                                               7.1e-04
                                                                                          5.7e-01
          0.046764840575
##
     3
          0.046228237059
                             0.001605337160
                                                0.000010273248
                                                                   1.1e+03
                                                                               2.6e-04
                                                                                          4.8e-01
##
     4
          0.045986795559
                             0.001623570252
                                                0.000010206146
                                                                   9.9e+01
                                                                               3.9e-05
                                                                                          5.0e-01
##
     5
          0.045951197971
                             0.001626526332
                                                0.000010194705
                                                                   1.7e+01
                                                                               6.0e-06
                                                                                          6.6e-01
##
          0.045945636306
                             0.001626980803
                                                0.000010192955
                                                                   2.5e+00
                                                                               9.3e-07
                                                                                          1.5e+00
##
     7
          0.045944775691
                             0.001627051275
                                                0.000010192684
                                                                   3.9e-01
                                                                               1.4e-07
                                                                                          3.3e+00
##
     8
          0.045944642346
                             0.001627062190
                                                0.000010192642
                                                                   6.1e-02
                                                                               2.2e-08
                                                                                          3.0e+00
##
     9
          0.045944621690
                             0.001627063881
                                                0.000010192635
                                                                   9.4e-03
                                                                               3.5e-09
                                                                                          3.0e+00
##
  10
          0.045944618490
                             0.001627064143
                                                0.000010192634
                                                                   1.5e-03
                                                                               5.4e-10
                                                                                          3.0e+00
##
   11
          0.045944617994
                             0.001627064184
                                                0.000010192634
                                                                   2.3e-04
                                                                               8.3e-11
                                                                                          3.0e+00
##
   12
          0.045944617917
                             0.001627064190
                                                0.000010192634
                                                                   3.5e-05
                                                                               1.3e-11
                                                                                          3.0e+00
## 13
          0.045944617905
                             0.001627064191
                                                0.000010192634
                                                                   5.4e-06
                                                                               2.0e-12
                                                                                          3.0e+00
##
          0.045944617903
                             0.001627064191
                                                0.000010192634
                                                                   8.4e-07
                                                                               3.1e-13
                                                                                          3.0e+00
##
  15
          0.045944617903
                             0.001627064191
                                                0.000010192634
                                                                   1.3e-07
                                                                               4.8e-14
                                                                                          3.0e+00
##
   16
          0.045944617903
                             0.001627064191
                                                0.000010192634
                                                                   2.0e-08
                                                                               7.4e-15
                                                                                          3.0e+00
          0.045944617903
## 17
                                                0.000010192634
                                                                   3.0e-09
                                                                               1.2e-15
                             0.001627064191
                                                                                          3.0e+00
##
  18
          0.045944617903
                             0.001627064191
                                                0.000010192634
                                                                   1.7e-09
                                                                               1.9e-16
                                                                                          3.0e+00
## 19
          0.045944617903
                             0.001627064191
                                                0.000010192634
                                                                   9.3e-10
                                                                               3.6e-17
                                                                                          3.0e+00
cat("MLE_beta = ",MLE_beta)
## MLE beta = 0.04594462 0.001627064 1.019263e-05
Therefore, the MLE of \beta is \hat{\beta} = (4.59 \cdot 10^{-2}, 1.63 \cdot 10^{-3}, 1.02 \cdot 10^{-5})^T.
```

(b)

```
plot(Dose, Tumor_incidence/Number_tested, lwd=2, ylab="Proportion of positive response", pch=16, main=""
x = seq(0,250, length=100)
lines(x, 1 - exp(-MLE_beta[1] - MLE_beta[2]*x - MLE_beta[3]*x^2), col='purple', lwd=3)
legend(50, 0.6, c("Data", "Model") ,col=c("black", "purple"), pch = 16)
```

# **Probability of Tumor incidence in function of the Dose**



### Problem J-2.5:

(a)

```
##
##
             beta_0
                                beta_1
                                                  beta_2
                                                                   ||grad||
                                                                                 MRE
                                                                                          CV ratio
    it
          0.00000000000
                                                0.00000000000
                                                                    2.4e + 02
##
     1
                             0.00000000000
                                                                               8.1e+00
                                                                                           1.1e+00
          -6.124979085543
                              2.035718241648
                                                  2.857736621916
                                                                     4.1e+01
                                                                                3.1e+00
                                                                                            7.8e-01
##
     2
##
     3
          -8.673430233033
                              2.895866528488
                                                  4.076634312631
                                                                     7.1e+00
                                                                                1.0e+00
                                                                                            2.4e-01
     4
          -9.492692680136
                              3.173968058887
                                                  4.474456484213
                                                                     4.5e-01
                                                                                8.4e-02
                                                                                            1.9e-02
##
##
     5
          -9.561642171111
                              3.197412849302
                                                  4.508373266712
                                                                     2.6e-03
                                                                                5.4e - 04
                                                                                            1.2e-04
          -9.562084856863
                                                                     9.6e-08
                                                                                2.2e-08
                                                                                            9.0e-05
##
     6
                              3.197563497368
                                                  4.508593172694
##
     7
          -9.562084874971
                              3.197563503535
                                                  4.508593181753
                                                                     1.0e-12
                                                                                2.5e-15
                                                                                            3.0e+00
cat("MLE_beta = ",MLE_beta)
```

## MLE\_beta = -9.562085 3.197564 4.508593

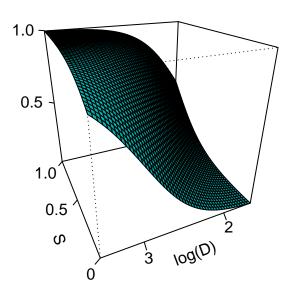
Therefore, the MLE of  $\beta$  is  $\hat{\beta} = (-9.5621, 3.1976, 4.5086)^T$ .

### (b)

```
n=50
x1 = seq(0,1, length=n) # = S
x2 = seq(min(X[,2]), max(X[,2]), length=n) #log (D)
x3 = outer(x1, x2, pi_fct_MLE) #pi(S, log(D))

persp(x1,x2,x3, theta=245, phi=25, r=2, shade=0.4, axes=TRUE, box=TRUE, ticktype="detailed", nticks= 3, col="cyan", xlab="S", ylab="log(D)", zlab="", main=expression(paste(pi,'(', beta, ')')), expand = 1)
```





(c)

```
#prediction of the model for S = 0.3 and D = 10
pi_fct_MLE(0.3, log(10))
```

## [1] 0.3000949

Therefore, for a Severity of 0.3 and a tree Diameter of 10, our model predicts that there is a probbility of 0.30 that the tree would be blown down.