# Assignment 1: Survival Analysis

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### Question 1

#### Question 1 d:

```
age = rep(22:29, 2)
death = c(433, 412, 337, 331, 287, 242, 215, 192,
     24, 36, 66, 102, 138, 171, 185, 200)
personyears = c(91444, 86835, 75892, 63241, 52023, 42123, 36915, 32215,
               8556, 12708, 23203, 35415, 46207, 55675, 60470, 64770)
z = c(rep(0, 8), rep(1, 8))
model2 = glm(death ~ z + factor(age) + offset(log(personyears)),
            family = poisson(link="log") )
summary(model2)
##
## Call:
## glm(formula = death ~ z + factor(age) + offset(log(personyears)),
##
      family = poisson(link = "log"))
##
## Deviance Residuals:
       Min
                 1Q
                       Median
                                    3Q
                                             Max
## -0.44325 -0.14770
                      0.00831
                                0.30377
                                         1.05482
## Coefficients:
                Estimate Std. Error z value Pr(>|z|)
               -5.348768 0.046822 -114.235 < 2e-16 ***
## (Intercept)
## z
               ## factor(age)23 0.004702 0.066494
                                     0.071 0.94362
## factor(age)24 -0.044167 0.068449
                                    -0.645 0.51876
## factor(age)25 0.097314 0.067515
                                      1.441 0.14948
## factor(age)26 0.145055 0.068388
                                      2.121 0.03392 *
## factor(age)27 0.179327 0.069648
                                     2.575 0.01003 *
## factor(age)28 0.183552
                           0.070734
                                      2.595 0.00946 **
## factor(age)29 0.197412
                           0.071658
                                     2.755 0.00587 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for poisson family taken to be 1)
##
      Null deviance: 226.5601 on 15 degrees of freedom
                      2.2334 on 7 degrees of freedom
## Residual deviance:
## AIC: 131.32
##
```

## Number of Fisher Scoring iterations: 3

The coefficient of the marital status is -0.602. Therefore, its exponential is 0.5477151. Which is the rate ratio between being single and married. Hence, the mortality rate of people who are single is twice that of those who are single (after adjusting for age). Or in other words . . . The hazard rate.

#### Question 1 e:

The below code produces the expected number of events in age/marital status.

We look at expected number of events in each age/marital status per 100,000 person years.

Need to exponentiate the coefficient estimates and we get the following:

Table 1: Expected number of events for each age/marital status group.

Age	Single	Married
22	475	260
23	478	262
24	455	249
25	524	287
26	550	301
27	569	311
28	571	313
29	579	317

#### Question 1 f:

```
## Deviance Residuals:
  ##
## Coefficients:
                  Estimate Std. Error z value Pr(>|z|)
                 -5.352744 0.048057 -111.383 < 2e-16 ***
## (Intercept)
                 -0.523590 0.209705 -2.497 0.01253 *
                 0.002003 0.068823
                                       0.029 0.97679
## factor(age)23
## factor(age)24
                 -0.064239
                            0.072642
                                     -0.884 0.37652
## factor(age)25
                 0.100155 0.073011
                                      1.372 0.17013
## factor(age)26
                  0.152785
                            0.076117
                                       2.007 0.04472 *
                                       2.409 0.01600 *
## factor(age)27
                  0.193333 0.080260
## factor(age)28
                  0.207009
                           0.083430
                                     2.481 0.01309 *
## factor(age)29
                  0.230052
                           0.086705 2.653 0.00797 **
## z:factor(age)23 0.007864
                            0.272362
                                       0.029 0.97697
## z:factor(age)24 0.078191
                            0.249189
                                       0.314 0.75369
## z:factor(age)25 -0.073738
                                      -0.309 0.75702
                           0.238330
## z:factor(age)26 -0.090084
                            0.233895
                                      -0.385 0.70013
## z:factor(age)27 -0.102622
                            0.232285
                                      -0.442 0.65864
                                      -0.517 0.60502
## z:factor(age)28 -0.120222
                            0.232449
## z:factor(age)29 -0.133998
                            0.232776
                                      -0.576 0.56485
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for poisson family taken to be 1)
##
##
      Null deviance: 2.2656e+02 on 15 degrees of freedom
## Residual deviance: 1.4699e-13 on 0 degrees of freedom
## AIC: 143.08
##
## Number of Fisher Scoring iterations: 3
```

## Question 4

#### Question 4 a:

```
rm(list=ls())

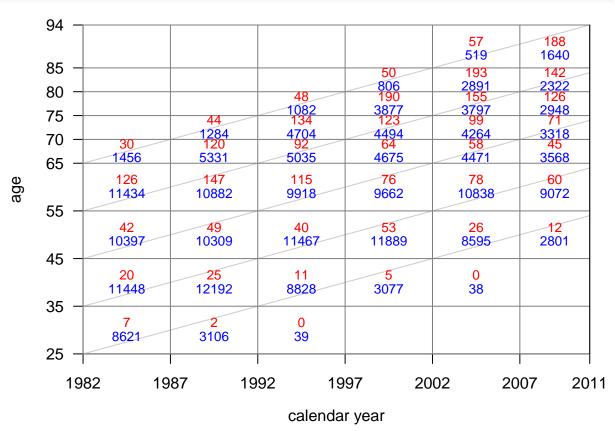
data=read.csv("http://individual.utoronto.ca/osaarela/finrisk82.csv", sep = ";")

###### Function to transform the data.

dataset = data
dataset$events <- as.numeric(dataset$events)
dataset$followupyears <- as.numeric(dataset$followupyears)
dataset$year <- as.numeric(dataset$year)
ncol(dataset)
nrow(dataset)
by(as.numeric(dataset$events), dataset$endpoint, sum)
by(as.numeric(dataset$followupyears), dataset$endpoint, sum)
# Plot Lexis diagram:</pre>
```

```
str(dataset)
table(dataset$endpoint)
frdeaths <- dataset[dataset$endpoint == 'DEATH',]</pre>
chddeaths <- dataset[dataset$endpoint == 'CHD2',!(names(dataset) %in% c('endpoint','followupyears'))]
names(chddeaths)[names(chddeaths) == 'events'] <- 'chd'</pre>
frdeaths <- merge(frdeaths, chddeaths)</pre>
frdeaths <- frdeaths[,!(names(frdeaths) %in% 'endpoint')]</pre>
table(frdeaths$events >= frdeaths$chd)
frdeaths$yearmid <- 1984.5 * (frdeaths$year >= 1982 & frdeaths$year < 1987) +
  1989.5 * (frdeaths$year >= 1987 & frdeaths$year < 1992) +
 1994.5 * (frdeaths$year >= 1992 & frdeaths$year < 1997) +
  1999.5 * (frdeaths$year >= 1997 & frdeaths$year < 2002) +
  2004.5 * (frdeaths$year >= 2002 & frdeaths$year < 2007) +
  2009 * (frdeaths\$year >= 2007 & frdeaths\$year < 2011)
frdeaths$agemid <- 30 * (frdeaths$agegr == '<35') +</pre>
  40 * (frdeaths$agegr == '35-44') +
  50 * (frdeaths$agegr == '45-54') +
  60 * (frdeaths agegr == '55-64') +
  67.5 * (frdeaths * agegr == '65-69') +
  72.5 * (frdeaths agegr == '70-74') +
 77.5 * (frdeaths$agegr == '75-79') +
 82.5 * (frdeaths$agegr == '80-84') +
 89.0 * (frdeaths$agegr == '>85')
fragg <- aggregate(frdeaths[,c('events','followupyears')], by=list(frdeaths$yearmid, frdeaths$agemid),</pre>
\# postscript(file.path(outpath, 'frlexis.eps'), width=6, height=6, paper='special', horizontal=FALSE)
op \leftarrow par(mar=c(4,4,0,0), mgp=c(2,1,0))
minyr <- 1982
maxyr <- 2011
minage <- 25
maxage <- 94
plot(NULL, NULL, type='n', xlim=c(minyr, maxyr), ylim=c(minage, maxage), axes=FALSE,
     xlab='calendar year', ylab='age', main='')
axis(1, at=c(seq(minyr, maxyr, by=5), 2011), las=1, pos=minage)
axis(2, at=c(25,35,45,55,65,70,75,80,85,94), las=1, pos=minyr)
ygrid \leftarrow c(seq(minyr, 2007, by=5), 2011)
agrid \leftarrow c(25,35,45,55,65)
segments(rep(minyr, length(agrid)), agrid, pmin(minyr + (maxage - agrid), maxyr), pmin(agrid + (maxyr -
ygrid <- c(seq(minyr, 2007, by=5), 2011)</pre>
agrid \leftarrow c(25,35,45,55,65,70,75,80,85,94)
segments(rep(minyr, length(agrid)), agrid, rep(maxyr, length(agrid)), agrid, col='gray50')
segments(ygrid, rep(minage, length(ygrid)), ygrid, rep(maxage, length(ygrid)), col='gray50')
lines(c(maxyr, maxyr), c(minage, maxage))
ygrid \leftarrow seq(1840, 1950, by=10)
agrid <- seq(20, 90, by=5)
for(i in 1:nrow(fragg)) {
  text(fragg[i, 'Group.1'], fragg[i, 'Group.2'], fragg[i, 'events'], pos=3, offset=0.15, cex=0.8, col='red
```

```
text(fragg[i,'Group.1'], fragg[i,'Group.2'], round(fragg[i,'followupyears']), pos=1, offset=0.15, cex
}
```



```
par(op)
# dev.off()
# Analysis variables:
frdeaths$ageg <- 1 * (frdeaths$agegr == '<35') +</pre>
  2 * (frdeaths$agegr == '35-44') +
  3 * (frdeaths$agegr == '45-54') +
  4 * (frdeaths$agegr == '55-64') +
  5 * (frdeaths$agegr == '65-69') +
  6 * (frdeaths$agegr == '70-74') +
 7 * (frdeaths$agegr == '75-79') +
  8 * (frdeaths$agegr == '80-84') +
  9 * (frdeaths$agegr == '>85')
frdeaths$yearg <- frdeaths$year - min(frdeaths$year) + 1</pre>
frdeaths$sexg <- 0 * (frdeaths$sex == 'men') +</pre>
  1 * (frdeaths$sex == 'women')
frdeaths$area <- 0 * (frdeaths$rua == 'FIN-EASa') +</pre>
  1 * (frdeaths$rua == 'FIN-WESa')
nyears <- length(unique(frdeaths$yearg))</pre>
nagegroups <- length(unique(frdeaths$ageg))</pre>
# Poisson regression for total mortality:
```

```
modelfit <- glm(events ~ as.factor(yearg) + as.factor(ageg) + sexg + area, offset=log(followupyears), d</pre>
summary(modelfit)
#summary(as.factor(frdeaths$area))
# Poisson regression for CHD mortality:
model_chd <- glm(chd ~ as.factor(yearg) + as.factor(ageg) + sexg + area, offset=log(followupyears), dat
summary(model_chd)
##
## Call:
## glm(formula = chd ~ as.factor(yearg) + as.factor(ageg) + sexg +
      area, family = poisson(link = "log"), data = frdeaths, offset = log(followupyears))
##
## Deviance Residuals:
##
      Min
               10
                   Median
                               3Q
                                       Max
                  -0.2500
  -2.4236 -0.8387
                            0.3324
                                    2.5996
## Coefficients:
                     Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                    -22.671183 644.686237 -0.035 0.971947
## as.factor(yearg)2
                    -0.088995
                               0.365978 -0.243 0.807874
## as.factor(yearg)3
                              0.385413 -1.068 0.285476
                    -0.411659
## as.factor(yearg)4
                    ## as.factor(yearg)5
                    ## as.factor(yearg)6
                    ## as.factor(yearg)7
                    -0.133568 0.337142
                                        -0.396 0.691975
## as.factor(yearg)8
                   ## as.factor(yearg)9
                    -0.296691 0.333802 -0.889 0.374098
## as.factor(yearg)10
                    -0.265291   0.327366   -0.810   0.417721
## as.factor(yearg)11
                    -0.615961 0.342148
                                        -1.800 0.071817
## as.factor(yearg)12
                    -0.666657 0.340316 -1.959 0.050120
## as.factor(yearg)13
                    -0.641137 0.332519
                                        -1.928 0.053840
## as.factor(yearg)14
                    -0.755372 0.333069
                                        -2.268 0.023334 *
                                       -2.236 0.025336 *
## as.factor(yearg)15
                    -0.732211 0.327430
## as.factor(yearg)16
                    ## as.factor(yearg)17
                    -0.795724 0.324579
                                       -2.452 0.014224 *
                    -0.790958 0.320629
## as.factor(yearg)18
                                        -2.467 0.013629 *
## as.factor(yearg)19
                    ## as.factor(yearg)20
                    -1.269514   0.334395   -3.796   0.000147 ***
## as.factor(yearg)21
                    -0.925976 0.317807
                                        -2.914 0.003572 **
## as.factor(yearg)22
                                        -3.581 0.000342 ***
                    -1.162812
                              0.324709
                    -1.214519
## as.factor(yearg)23
                             0.323213 -3.758 0.000172 ***
## as.factor(yearg)24
                    -1.177274
                               0.318902 -3.692 0.000223 ***
                               0.327034 -4.476 7.62e-06 ***
## as.factor(yearg)25
                    -1.463688
## as.factor(yearg)26
                    -1.427742
                               0.324009
                                        -4.406 1.05e-05 ***
                               0.336079 -5.203 1.96e-07 ***
## as.factor(yearg)27
                    -1.748577
## as.factor(yearg)28
                    -1.774635
                               0.335458
                                        -5.290 1.22e-07 ***
## as.factor(yearg)29
                    -1.376675
                               0.319735
                                        -4.306 1.66e-05 ***
## as.factor(ageg)2
                    14.360501 644.686394
                                         0.022 0.982228
## as.factor(ageg)3
                    16.728064 644.686216
                                         0.026 0.979299
## as.factor(ageg)4
                    17.910959 644.686206
                                         0.028 0.977836
## as.factor(ageg)5
                                         0.029 0.976939
                    18.635925 644.686211
## as.factor(ageg)6
                    19.379127 644.686213
                                         0.030 0.976019
```

```
## as.factor(ageg)7
                     20.040912 644.686214
                                          0.031 0.975201
                                          0.032 0.974448
                     20.649429 644.686218
## as.factor(ageg)8
                                          0.033 0.973380
## as.factor(ageg)9
                     21.513103 644.686224
                                0.070821 -13.388 < 2e-16 ***
## sexg
                     -0.948166
## area
                     -0.160443
                                0.070951
                                         -2.261 0.023740 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
  (Dispersion parameter for poisson family taken to be 1)
##
##
      Null deviance: 2121.50 on 719 degrees of freedom
## Residual deviance: 606.49 on 681 degrees of freedom
  AIC: 1623.9
##
## Number of Fisher Scoring iterations: 16
# Poisson regression for CHD mortality:
# frdeaths$nonchd = frdeaths$events - frdeaths$chd
model_nonchd <- glm(events - chd ~ as.factor(yearg) + as.factor(ageg) + sexg + area, offset=log(followu
summary(model_chd)
##
## Call:
  glm(formula = chd ~ as.factor(yearg) + as.factor(ageg) + sexg +
      area, family = poisson(link = "log"), data = frdeaths, offset = log(followupyears))
##
## Deviance Residuals:
      Min
               1Q
                    Median
                                30
                                        Max
## -2.4236 -0.8387 -0.2500
                            0.3324
                                     2.5996
##
## Coefficients:
                      Estimate Std. Error z value Pr(>|z|)
                    -22.671183 644.686237 -0.035 0.971947
## (Intercept)
## as.factor(yearg)2
                    -0.088995
                              0.365978 -0.243 0.807874
## as.factor(yearg)3
                     -0.411659
                              0.385413 -1.068 0.285476
## as.factor(yearg)4
                     ## as.factor(yearg)5
                     -0.191774
                                0.350204
                                         -0.548 0.583963
## as.factor(yearg)6
                     ## as.factor(yearg)7
                     ## as.factor(yearg)8
                     ## as.factor(yearg)9
                     -0.296691 0.333802
                                         -0.889 0.374098
## as.factor(yearg)10
                    -0.265291 0.327366 -0.810 0.417721
## as.factor(yearg)11
                     -0.615961
                                0.342148 -1.800 0.071817 .
## as.factor(yearg)12
                     -0.666657
                                0.340316 -1.959 0.050120
## as.factor(yearg)13
                                         -1.928 0.053840
                     -0.641137
                                0.332519
## as.factor(yearg)14
                     -0.755372
                                0.333069 -2.268 0.023334 *
## as.factor(yearg)15
                     -0.732211
                                0.327430
                                         -2.236 0.025336 *
## as.factor(yearg)16
                     -0.971682
                                         -2.891 0.003840 **
                                0.336107
                                         -2.452 0.014224 *
## as.factor(yearg)17
                     -0.795724
                                0.324579
## as.factor(yearg)18
                    -0.790958
                                0.320629 -2.467 0.013629 *
## as.factor(yearg)19
                     -1.052493
                                0.327903 -3.210 0.001328 **
## as.factor(yearg)20
                     -1.269514
                                0.334395
                                         -3.796 0.000147 ***
## as.factor(yearg)21 -0.925976
                                0.317807 -2.914 0.003572 **
## as.factor(yearg)22 -1.162812
                                0.324709 -3.581 0.000342 ***
```

```
## as.factor(yearg)23 -1.214519 0.323213 -3.758 0.000172 ***
## as.factor(yearg)24 -1.177274 0.318902 -3.692 0.000223 ***
## as.factor(yearg)25 -1.463688 0.327034 -4.476 7.62e-06 ***
## as.factor(yearg)26 -1.427742
                                0.324009 -4.406 1.05e-05 ***
## as.factor(yearg)27
                      -1.748577
                                  0.336079 -5.203 1.96e-07 ***
## as.factor(yearg)28 -1.774635
                                  0.335458 -5.290 1.22e-07 ***
## as.factor(yearg)29 -1.376675
                                  0.319735 -4.306 1.66e-05 ***
## as.factor(ageg)2
                      14.360501 644.686394
                                             0.022 0.982228
## as.factor(ageg)3
                      16.728064 644.686216
                                            0.026 0.979299
## as.factor(ageg)4 17.910959 644.686206 0.028 0.977836
## as.factor(ageg)5 18.635925 644.686211
                                            0.029 0.976939
                   19.379127 644.686213
20.040912 644.686214
## as.factor(ageg)6
                                             0.030 0.976019
## as.factor(ageg)7
                                            0.031 0.975201
## as.factor(ageg)8
                      20.649429 644.686218
                                             0.032 0.974448
## as.factor(ageg)9
                      21.513103 644.686224
                                             0.033 0.973380
## sexg
                      -0.948166
                                  0.070821 -13.388 < 2e-16 ***
## area
                      -0.160443
                                  0.070951 -2.261 0.023740 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for poisson family taken to be 1)
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      Null deviance: 2121.50 on 719 degrees of freedom
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```