## Exercise 6C: Hazard Ratios

**Problem 1.** Examine the association between blood lead and cardiovascular mortality (**d\_cvd**) over time (**pmon\_mec**). Use the covariates (confounders) considered above. Check which covariates violate the proportional hazard assumption.

```
Call:
coxph(formula = Surv(pmon mec, d cvd) ~ bpb + age + factor(sex) +
  factor(race) + factor(educ) + factor(smk) + factor(alc))
          coef exp(coef) se(coef) z
          0.0169 1.0171 0.0118 1.43 0.1521
bpb
          age
factor(sex)2 -0.3106 0.7330 0.0960 -3.23 0.0012
factor(race)2 0.2273
                    1.2552 0.1034 2.20 0.0279
factor(educ)2 0.0720 1.0746 0.0911 0.79 0.4297
factor(educ)3 -0.2390 0.7874 0.1554 -1.54 0.1241
factor(educ)NaN 0.3270 1.3868 0.3843 0.85 0.3948
factor(smk)2
            0.0783 1.0814 0.1009 0.78 0.4379
factor(smk)3 0.3997 1.4915 0.1270 3.15 0.0016
factor(alc)1 -0.2994 0.7412 0.1046 -2.86 0.0042
factor(alc)NaN 0.1245 1.1325 0.2118 0.59 0.5568
Likelihood ratio test=1358 on 11 df, p=0
n= 5069, number of events= 576
 (5 observations deleted due to missingness)
```

All factors in the model appeared to have a positive linear relationship with cardiovascular mortality, with the exception of being female, having 16+ years of education, and reporting yes to alcohol consumption. These three factors appear to be protective due to their negative linear relationship with cardiovascular mortality, though it is worth noting that the 16+ years of education factor has a high p-value of 0.1241, which is greater than our alpha level of 0.05 and therefore not likely to be protective at a statistically significant level. Among the factors that appeared to risk factors for cardiovascular mortality, the only factors that were statistically significant (p-value < 0.05) were age, being black, and being a current smoker.

## Proportional Hazard Assumption test:

rho chisq -0.02666 0.3798 0.5377 bpb 0.00832 0.0385 0.8444 age factor(sex)2 0.07714 3.4761 0.0623 factor(race)2 -0.01900 0.1936 0.6600 factor(educ)2 0.03268 0.6227 0.4301 factor(educ)3 -0.00957 0.0529 0.8181 factor(educ)NaN -0.05245 1.5806 0.2087 factor(smk)2 0.04328 1.1095 0.2922 factor(smk)3 0.05015 1.3611 0.2433 factor(alc)1 -0.01541 0.1378 0.7104 factor(alc)NaN -0.04472 1.1861 0.2761 NA 10.5836 0.4788 GLOBAL

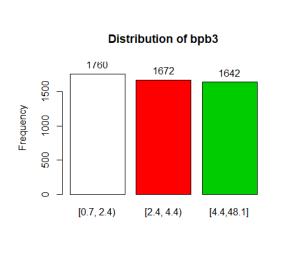
Because all of the p-values are above the alpha threshold of 0.05, this indicates that none of the covariates are in violation of the proportionality assumption.

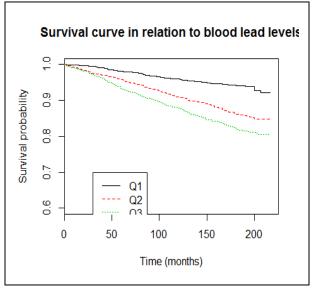
Problem 2. Compute hazard ratio (HR) (95% CI) per for a 1-SD increase in blood lead using the covariates above.

Hazard Ratio: 1.0562 (0.98, 1.138). We can interpret this to mean that for every 1-SD increase in blood lead levels, rates of cardiovascular mortality events are 5.62% higher in the individuals with the higher blood lead levels. It is relevant to note that this hazard ratio had a p-value of 0.152, which is greater than our standard alpha threshold of 0.05 for determining statistical significance and therefore does not represent a statistically significant hazard ratio.

**Problem 3.** Compare the lowest vs. the highest tertiles of blood lead using the covariates

above. Compute HR and 95% CI.





Comparing the highest tertile of blood lead levels against the lowest tertile resulted in a hazard ratio of 1.2792 (1.0013, 1.6343) We can interpret this to mean that the group in the highest tertile of blood lead levels experienced cardiovascular mortality at rates 0.13% higher compared to the lowest blood level tertile group. It is relevant to note that this hazard ratio had a p-value of 0.04878, which is lower than our standard alpha threshold of 0.05 for determining statistical significance and appears to be (just barely) statistically significant.

## Code.

```
>#EPID 674 | HW 6C | Stephanie Mecham
>setwd("\Users\smecham\Desktop\Hw2") #setting working directory
>#Installing and Calling Packages
>library(foreign)
>library(Hmisc)
>library(stargazer)
>library(sas7bdat)
>install.packages("C:/Users/smecham/Desktop/epicalc 2.15.1.0.tar.gz", repos = NULL, type =
"source")
>install.packages("C:/Users/smecham/Desktop/epicalc 2.
15.1.0.tar.gz", repos = NULL, type = "source") * installing
*source* package 'epicalc' ...
** package 'epicalc' successfully unpacked and MD5 sums
checked
** R
** data
** demo
** preparing package for lazy loading
** help
*** installing help indices
** building package indices
** testing if installed package can be loaded
* DONE (epicalc)
>library(epicalc)
> library(survival)
>#Importing file & attaching
>options(max.print=999999)
>read.sas7bdat("nhanes3.sas7bdat")
> nhanes <- read.sas7bdat("nhanes3.sas7bdat")
> save(nhanes, file="nhanes3.rda") #saving for future use
> attach(nhanes)
>#Problem One: Running a Cox Regression with Covariates
> cox.bpb <- coxph(Surv(pmon_mec, d_cvd) ~ bpb + age + factor(sex) + factor(race) +
factor(educ) + factor(smk) + factor(alc))
>coxph(Surv(pmon_mec, d_cvd) ~ bpb + age + factor(sex) + factor(race) + factor(educ) +
factor(smk) + factor(alc))
> summary(cox.bpb)
 Call:
coxph(formula = Surv(pmon_mec, d_cvd) ~ bpb + age + factor(sex) +
   factor(race) + factor(educ) + factor(smk) + factor(alc))
  n= 5069, number of events= 576
  (5 observations deleted due to missingness)
              coef exp(coef) se(coef)
                                         z Pr(>|z|)
             0.016945 1.017089 0.011832 1.432 0.15211
dad
             0.100316 1.105521 0.003698 27.126 < 2e-16
age
factor(sex)2 -0.310570 0.733029 0.096033 -3.234 0.00122
```

```
0.227329 1.255243 0.103410 2.198 0.02792
factor(race)2
factor(educ)2
               0.071961 1.074614 0.091118 0.790 0.42967
factor(educ)3 -0.239028 0.787393 0.155431 -1.538 0.12409
factor(educ)NaN 0.327016 1.386824 0.384258 0.851 0.39475
factor(smk)2
               0.078291 1.081438 0.100932 0.776 0.43793
               0.399752 1.491455 0.126951 3.149 0.00164
factor(smk)3
factor(alc)1 -0.299455 0.741222 0.104547 -2.864 0.00418
factor(alc)NaN 0.124456 1.132532 0.211810 0.588 0.55681
dad
age
factor(sex)2
factor(race)2
factor(educ)2
factor(educ)3
factor(educ)NaN
factor(smk)2
factor(smk)3
factor(alc)1
factor(alc)NaN
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
          exp(coef) exp(-coef) lower .95 upper .95
bpb
              1.0171
                       0.9832
                               0.9938
                                        1.0410
             1.1055
                      0.9046
                               1.0975
                                       1.1136
age
factor(sex)2
                0.7330
                         1.3642
                                 0.6073
                                          0.8848
factor(race)2
                1.2552
                         0.7967
                                  1.0250
                                           1.5373
factor(educ)2
                1.0746
                          0.9306
                                  0.8989
                                           1.2847
                0.7874
factor(educ)3
                          1.2700
                                  0.5806
                                           1.0678
                                    0.6530
factor(educ)NaN
                  1.3868
                           0.7211
                                             2.9451
factor(smk)2
                1.0814
                          0.9247
                                  0.8873
                                           1.3180
                1.4915
factor(smk)3
                          0.6705
                                 1.1629
                                          1.9128
               0.7412
                        1.3491 0.6039 0.9098
factor(alc)1
factor(alc)NaN
                 1.1325
                          0.8830 0.7478 1.7153
Concordance = 0.885 (se = 0.012)
Rsquare= 0.235 (max possible= 0.849)
Likelihood ratio test= 1358 on 11 df, p=0
                = 878.7 on 11 df, p=0
Wald test
Score (logrank) test = 1334 on 11 df, p=0
> #Testing for Proportional Hazards Assumption
> test.prop <- cox.zph(cox.bpb)</pre>
> test.prop
            rho chisq
bpb
           -0.02666 0.3798 0.5377
           0.00832 0.0385 0.8444
age
factor(sex)2
             0.07714 3.4761 0.0623
factor(race)2 -0.01900 0.1936 0.6600
             0.03268 0.6227 0.4301
factor(educ)2
factor(educ)3 -0.00957 0.0529 0.8181
factor(educ)NaN -0.05245 1.5806 0.2087
factor(smk)2
              0.04328 1.1095 0.2922
factor(smk)3
             0.05015 1.3611 0.2433
factor(alc)1 -0.01541 0.1378 0.7104
```

factor(alc)NaN -0.04472 1.1861 0.2761

```
GLOBAL
```

```
>#Standardizing blood level variable so one unit increase = 1-SD unit increase
> zbpb <- (bpb - mean(bpb)) / sd(bpb)</pre>
> zcox <- coxph(Surv(pmon mec, d cvd) ~ zbpb + age + factor(sex) + factor(race) +
factor(educ) + factor(smk) + factor(alc))
>#Finding Hazard Ratios & 95% Confidence Intervals
>
> summary(zcox)
Call:
coxph(formula = Surv(pmon mec, d cvd) ~ zbpb + age + factor(sex) +
   factor(race) + factor(educ) + factor(smk) + factor(alc))
  n= 5069, number of events= 576
  (5 observations deleted due to missingness)
             coef exp(coef) se(coef)
                                       z Pr(>|z|)
             0.054693 1.056216 0.038190 1.432 0.15211
zbpb
            0.100316 1.105521 0.003698 27.126 < 2e-16
age
factor(sex)2
              -0.310570 0.733029 0.096033 -3.234 0.00122
factor(race)2
               0.227329 1.255243 0.103410 2.198 0.02792
factor(eduć)2
               0.071961 1.074614 0.091118 0.790 0.42967
factor(educ)3 -0.239028 0.787393 0.155431 -1.538 0.12409
factor(educ)NaN 0.327016 1.386824 0.384258 0.851 0.39475
factor(smk)2
               0.078291 1.081438 0.100932 0.776 0.43793
factor(smk)3
               0.399752 1.491455 0.126951 3.149 0.00164
factor(alc)1 -0.299455 0.741222 0.104547 -2.864 0.00418
factor(alc)NaN 0.124456 1.132532 0.211810 0.588 0.55681
zbpb
age
factor(sex)2
factor(race)2
factor(educ)2
factor(educ)3
factor(educ)NaN
factor(smk)2
factor(smk)3
factor(alc)1
factor(alc)NaN
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
          exp(coef) exp(-coef) lower .95 upper .95
zbpb
              1.0562
                       0.9468
                                0.9800
                                        1.1383
                                1.0975
              1.1055
                       0.9046
                                        1.1136
age
                0.7330
                         1.3642
                                  0.6073
factor(sex)2
                                           0.8848
factor(racé)2
                1.2552
                         0.7967
                                  1.0250
                                           1.5373
factor(educ)2
                1.0746
                          0.9306
                                  0.8989
                                           1.2847
factor(educ)3
                0.7874
                          1.2700
                                   0.5806
                                           1.0678
factor(educ)NaN
                  1.3868
                            0.7211
                                     0.6530 2.9451
factor(smk)2
                1.0814
                          0.9247
                                   0.8873
                                           1.3180
factor(smk)3
                1.4915
                          0.6705
                                  1.1629
                                            1.9128
               0.7412
factor(alc)1
                         1.3491 0.6039 0.9098
                 1.1325
factor(alc)NaN
                          0.8830 0.7478 1.7153
```

```
Concordance= 0.885 (se = 0.012)
 Rsquare= 0.235 (max possible= 0.849)
 Likelihood ratio test= 1358 on 11 df, p=0
Wald test = 878.7 on 11 df, p=0
Score (logrank) test = 1334 on 11 df, p=0
>#Problem 3
>#Creating tertiles of blood lead levels
> bpb3<-cut2(bpb, g=3)
 > tab1(bpb3)
 bpb3:
        Frequency Percent Cum. percent
  [0.7, 2.4)
                     34.7
              1760
                               34.7
  [2.4, 4.4)
              1672
                     33.0
                               67.6
  [4.4,48.1]
              1642 32.4
                               100.0
             5074 100.0
                              100.0
  Total
 >#Creating a K-M Life table and curve for blood lead tertiles
>fit.total.bpb3<-survfit(Surv(pmon_mec, d_cvd)~bpb3)
> options(max.print=999999)
> summary(fit.total.bpb3)
> plot(fit.total.bpb3, col=c(1:3), ltv=c(1:3), mark.time=F, vlim=c(0.6,1.0))
> title(main="Survival curve in relation to blood lead levels", xlab="Time (months)",
ylab="Survival probability")
> legend(30,0.7, legend=c("Q1","Q2","Q3"), lty=c(1:3), col=c(1:3))
>#Crude cox analysis with blood lead tertiles
> cox.bpb3<-coxph(Surv(pmon_mec, d_cvd)~bpb3)
> summary(cox.bpb3)
Call:
coxph(formula = Surv(pmon_mec, d_cvd) ~ bpb3)
 n= 5069, number of events= 576
 (5 observations deleted due to missingness)
          coef exp(coef) se(coef) z Pr(>|z|)
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
         exp(coef) exp(-coef) lower .95 upper .95
                        0.4316
bpb3[2.4, 4.4) 2.317
                                  1.825
                                          2.940
bpb3[4.4,48.1] 3.124
                         0.3201
                                   2.482
                                           3.931
Concordance= 0.617 (se = 0.012)
Rsquare= 0.022 (max possible= 0.849)
Likelihood ratio test= 110.5 on 2 df, p=0
                = 94.31 on 2 df, p=0
Wald test
Score (logrank) test = 102.7 on 2 df, p=0
>#Adjusted cox analysis, taking covariates into account
```

```
> cox.bpb3.adj<-coxph(Surv(pmon_mec,d_cvd)~bpb3+age+factor(sex)
+factor(race)+factor(educ)+factor(smk)+factor(alc))
> summary(cox.bpb3.adj)
Call:
coxph(formula = Surv(pmon_mec, d_cvd) ~ bpb3 + age + factor(sex) +
  factor(race) + factor(educ) + factor(smk) + factor(alc))
 n= 5069, number of events= 576
 (5 observations deleted due to missingness)
            coef exp(coef) se(coef)
                                      z Pr(>|z|)
bpb3[2.4, 4.4) 0.205342 1.227945 0.123367 1.664 0.09602 bpb3[4.4,48.1] 0.246265 1.279239 0.124973 1.971 0.04878
            0.099781 1.104929 0.003722 26.809 < 2e-16
age
factor(sex)2 -0.309090 0.734115 0.095486 -3.237 0.00121
factor(race)2  0.228858  1.257164  0.102869  2.225  0.02610
factor(educ)2 0.072873 1.075594 0.091120 0.800 0.42386
factor(educ)3 -0.233033 0.792127 0.155441 -1.499 0.13383
factor(educ)NaN 0.329578 1.390381 0.384572 0.857 0.39145
factor(smk)2
              0.066196 1.068436 0.101045 0.655 0.51240
              0.388816 1.475233 0.127210 3.056 0.00224
factor(smk)3
factor(alc)1 -0.304805 0.737267 0.104356 -2.921 0.00349
factor(alc)NaN 0.122506 1.130326 0.211695 0.579 0.56280
bpb3[2.4, 4.4)
bpb3[4.4,48.1]
age
factor(sex)2
factor(race)2
factor(educ)2
factor(educ)3
factor(educ)NaN
factor(smk)2
factor(smk)3
factor(alc)1
factor(alc)NaN
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
         exp(coef) exp(-coef) lower .95 upper .95
                         0.8144 0.9642 1.5638
bpb3[2.4, 4.4)
                1.2279
bpb3[4.4,48.1]
                1.2792
                          0.7817
                                  1.0013
                                           1.6343
             1.1049
                      0.9050
                              1.0969
                                        1.1130
age
                         1.3622
factor(sex)2
               0.7341
                                 0.6088 0.8852
                                          1.5380
factor(race)2
               1.2572
                         0.7954
                                  1.0276
factor(educ)2
                                  0.8997
                1.0756
                         0.9297
                                           1.2859
                0.7921
factor(educ)3
                          1.2624
                                  0.5841
                                           1.0743
                           0.7192
factor(educ)NaN
                 1.3904
                                    0.6543 2.9545
                                          1.3024
factor(smk)2
                1.0684
                         0.9359
                                  0.8765
factor(smk)3
                1.4752
                                  1.1497 1.8930
                         0.6779
factor(alc)1
               0.7373
                        1.3564 0.6009 0.9046
factor(alc)NaN
               1.1303
                          0.8847 0.7465 1.7116
Concordance= 0.885 (se = 0.012)
Rsquare= 0.235 (max possible= 0.849)
Likelihood ratio test= 1360 on 12 df, p=0
Wald test
               = 877.4 on 12 df, p=0
Score (logrank) test = 1333 on 12 df, p=0
```

> #End of code