Statistical Modelling Techniques ~ Elif Kartal

Analyze MROZ and AIDS2 datasets with truncated and censored regression, respectively.

Install and load needed packages:

```
install.packages("AER")
Installing package into '/cloud/lib/x86_64-pc-linux-gnu-library/4.4'
(as 'lib' is unspecified)
install.packages("censReg")
Installing package into '/cloud/lib/x86_64-pc-linux-gnu-library/4.4'
(as 'lib' is unspecified)
install.packages("truncreg")
Installing package into '/cloud/lib/x86_64-pc-linux-gnu-library/4.4'
(as 'lib' is unspecified)
install.packages("Ecdat")
Installing package into '/cloud/lib/x86_64-pc-linux-gnu-library/4.4'
(as 'lib' is unspecified)
install.packages("MASS")
Installing package into '/cloud/lib/x86_64-pc-linux-gnu-library/4.4'
(as 'lib' is unspecified)
library(MASS)
library(Ecdat)
Loading required package: Ecfun
Attaching package: 'Ecfun'
```

```
The following object is masked from 'package:base':
    sign
Attaching package: 'Ecdat'
The following object is masked from 'package:MASS':
    SP500
The following object is masked from 'package:datasets':
    Orange
library(AER)
Loading required package: car
Loading required package: carData
Attaching package: 'carData'
The following object is masked from 'package:Ecdat':
    Mroz
Loading required package: lmtest
Loading required package: zoo
Attaching package: 'zoo'
The following objects are masked from 'package:base':
    as.Date, as.Date.numeric
```

```
Loading required package: sandwich
Loading required package: survival
library(censReg)
Loading required package: maxLik
Loading required package: miscTools
Attaching package: 'miscTools'
The following object is masked from 'package:Ecfun':
    checkNames
Please cite the 'maxLik' package as:
Henningsen, Arne and Toomet, Ott (2011). maxLik: A package for maximum likelihood estimation
If you have questions, suggestions, or comments regarding the 'maxLik' package, please use a
https://r-forge.r-project.org/projects/maxlik/
Please cite the 'censReg' package as:
Henningsen, Arne (2017). censReg: Censored Regression (Tobit) Models. R package version 0.5.
If you have questions, suggestions, or comments regarding the 'censReg' package, please use
https://r-forge.r-project.org/projects/sampleselection/
library(truncreg)
Truncated Model:
```

```
data("Mroz", package = "Ecdat")

# Veriyi gözlemleyelim
summary(Mroz)
```

```
child6
                                               child618
 work
              hoursw
                                                                 agew
no :325
          Min.
                :
                     0.0
                           Min.
                                  :0.0000
                                            Min.
                                                   :0.000
                                                            Min.
                                                                    :30.00
yes:428
          1st Qu.:
                     0.0
                           1st Qu.:0.0000
                                            1st Qu.:0.000
                                                            1st Qu.:36.00
          Median : 288.0
                           Median :0.0000
                                            Median :1.000
                                                            Median :43.00
          Mean : 740.6
                           Mean
                                  :0.2377
                                            Mean
                                                   :1.353
                                                            Mean
                                                                    :42.54
          3rd Qu.:1516.0
                           3rd Qu.:0.0000
                                            3rd Qu.:2.000
                                                            3rd Qu.:49.00
          Max.
                 :4950.0
                           Max.
                                  :3.0000
                                            Max.
                                                   :8.000
                                                            Max.
                                                                    :60.00
    educw
                    hearnw
                                     wagew
                                                    hoursh
                                                                     ageh
      : 5.00
                     : 0.000
Min.
                Min.
                                 Min.
                                       :0.00
                                                Min.
                                                       : 175
                                                               Min.
                                                                       :30.00
1st Qu.:12.00
                1st Qu.: 0.000
                                 1st Qu.:0.00
                                                1st Qu.:1928
                                                               1st Qu.:38.00
Median :12.00
                Median : 1.625
                                 Median:0.00
                                                Median:2164
                                                               Median :46.00
      :12.29
                      : 2.375
                                                Mean
                                                       :2267
Mean
                Mean
                                 Mean
                                       :1.85
                                                               Mean
                                                                       :45.12
                3rd Qu.: 3.788
3rd Qu.:13.00
                                 3rd Qu.:3.58
                                                3rd Qu.:2553
                                                               3rd Qu.:52.00
      :17.00
Max.
                Max.
                       :25.000
                                 Max.
                                        :9.98
                                                Max.
                                                       :5010
                                                               Max.
                                                                       :60.00
    educh
                    wageh
                                      income
                                                      educwm
      : 3.00
                       : 0.4121
                                         : 1500
                                                         : 0.000
Min.
                Min.
                                  Min.
                                                  Min.
1st Qu.:11.00
                1st Qu.: 4.7883
                                  1st Qu.:15428
                                                  1st Qu.: 7.000
Median :12.00
                Median: 6.9758
                                  Median :20880
                                                  Median :10.000
Mean
      :12.49
                Mean
                     : 7.4822
                                  Mean
                                         :23081
                                                  Mean
                                                        : 9.251
3rd Qu.:15.00
                3rd Qu.: 9.1667
                                  3rd Qu.:28200
                                                  3rd Qu.:12.000
                       :40.5090
Max.
      :17.00
                Max.
                                  Max.
                                         :96000
                                                  Max.
                                                         :17.000
                                   city
    educwf
                   unemprate
                                              experience
Min. : 0.000
                 Min.
                       : 3.000
                                  no :269
                                            Min.
                                                 : 0.00
1st Qu.: 7.000
                 1st Qu.: 7.500
                                            1st Qu.: 4.00
                                  yes:484
Median : 7.000
                Median : 7.500
                                            Median: 9.00
Mean : 8.809
                 Mean
                        : 8.624
                                            Mean
                                                   :10.63
3rd Qu.:12.000
                 3rd Qu.:11.000
                                            3rd Qu.:15.00
Max.
       :17.000
                 Max.
                        :14.000
                                            Max.
                                                   :45.00
```

str(Mroz)

```
753 obs. of 18 variables:
'data.frame':
            : Factor w/ 2 levels "no", "yes": 2 2 2 2 2 2 2 2 2 ...
$ work
$ hoursw
            : int 1610 1656 1980 456 1568 2032 1440 1020 1458 1600 ...
            : int 1010100000...
$ child6
$ child618 : int 0 2 3 3 2 0 2 0 2 2 ...
            : int 32 30 35 34 31 54 37 54 48 39 ...
$ agew
$ educw
            : int
                  12 12 12 12 14 12 16 12 12 12 ...
            : num 3.35 1.39 4.55 1.1 4.59 ...
$ hearnw
$ wagew
            : num 2.65 2.65 4.04 3.25 3.6 4.7 5.95 9.98 0 4.15 ...
$ hoursh
                   2708 2310 3072 1920 2000 1040 2670 4120 1995 2100 ...
            : int
            : int 34 30 40 53 32 57 37 53 52 43 ...
$ ageh
```

```
$ educh
            : int 12 9 12 10 12 11 12 8 4 12 ...
             : num 4.03 8.44 3.58 3.54 10 ...
 $ wageh
                   16310 21800 21040 7300 27300 19495 21152 18900 20405 20425 ...
 $ income
            : int
             : int
                   12 7 12 7 12 14 14 3 7 7 ...
 $ educwm
                  77771477377...
 $ educwf
             : int
 $ unemprate : num 5 11 5 5 9.5 7.5 5 5 3 5 ...
             : Factor w/ 2 levels "no", "yes": 1 2 1 1 2 2 1 1 1 1 ...
 $ experience: int 14 5 15 6 7 33 11 35 24 21 ...
truncated <- subset(Mroz, wageh > 0)
```

```
model <- truncreg(wageh ~ educw + experience + I(experience^2) + ageh,</pre>
                   data = truncated, point = 0, direction = "left")
```

summary(truncated)

```
work
              hoursw
                                child6
                                                 child618
                                                                    agew
no :325
                 :
                                                     :0.000
                                                                      :30.00
          Min.
                      0.0
                            Min.
                                    :0.0000
                                              Min.
                                                               Min.
ves:428
          1st Qu.:
                      0.0
                            1st Qu.:0.0000
                                              1st Qu.:0.000
                                                               1st Qu.:36.00
          Median : 288.0
                            Median :0.0000
                                              Median :1.000
                                                              Median :43.00
          Mean
                 : 740.6
                            Mean
                                    :0.2377
                                                     :1.353
                                                               Mean
                                                                      :42.54
                                              Mean
          3rd Qu.:1516.0
                            3rd Qu.:0.0000
                                              3rd Qu.:2.000
                                                               3rd Qu.:49.00
                 :4950.0
                                   :3.0000
                                                     :8.000
                                                               Max.
                                                                      :60.00
          Max.
                            Max.
                                              Max.
    educw
                     hearnw
                                                                       ageh
                                      wagew
                                                      hoursh
       : 5.00
                        : 0.000
                                                          : 175
Min.
                Min.
                                          :0.00
                                                  Min.
                                                                  Min.
                                                                         :30.00
                                  Min.
1st Qu.:12.00
                1st Qu.: 0.000
                                  1st Qu.:0.00
                                                  1st Qu.:1928
                                                                  1st Qu.:38.00
Median :12.00
                Median : 1.625
                                  Median:0.00
                                                  Median:2164
                                                                  Median :46.00
Mean
      :12.29
                Mean
                      : 2.375
                                  Mean
                                          :1.85
                                                  Mean
                                                         :2267
                                                                  Mean
                                                                         :45.12
                                                  3rd Qu.:2553
3rd Qu.:13.00
                3rd Qu.: 3.788
                                  3rd Qu.:3.58
                                                                  3rd Qu.:52.00
       :17.00
Max.
                Max.
                        :25.000
                                  Max.
                                          :9.98
                                                  Max.
                                                         :5010
                                                                  Max.
                                                                         :60.00
    educh
                                                        educwm
                     wageh
                                        income
Min.
       : 3.00
                Min.
                        : 0.4121
                                   Min.
                                           : 1500
                                                    Min.
                                                           : 0.000
                                                    1st Qu.: 7.000
1st Qu.:11.00
                 1st Qu.: 4.7883
                                   1st Qu.:15428
Median :12.00
                Median: 6.9758
                                   Median :20880
                                                    Median :10.000
Mean
       :12.49
                Mean
                        : 7.4822
                                   Mean
                                           :23081
                                                    Mean
                                                            : 9.251
3rd Qu.:15.00
                 3rd Qu.: 9.1667
                                   3rd Qu.:28200
                                                    3rd Qu.:12.000
Max.
       :17.00
                Max.
                        :40.5090
                                   Max.
                                           :96000
                                                    Max.
                                                            :17.000
    educwf
                   unemprate
                                    city
                                                experience
       : 0.000
                         : 3.000
                                   no:269
                                              Min.
                                                     : 0.00
Min.
                 Min.
1st Qu.: 7.000
                 1st Qu.: 7.500
                                              1st Qu.: 4.00
                                   yes:484
Median : 7.000
                 Median : 7.500
                                              Median: 9.00
```

```
      Mean : 8.809
      Mean : 8.624
      Mean : 10.63

      3rd Qu.:12.000
      3rd Qu.:11.000
      3rd Qu.:15.00

      Max. :17.000
      Max. :14.000
      Max. :45.00
```

Elde edilen sonuçlar, bağımsız değişkenlerin saatlik ücretine etkisini açıkça göstermektedir. Eğitim düzeyi ve iş deneyimi, saatlik ücrete pozitif ve istatistiksel olarak anlamlı bir etkiye sahipken, yaş değişkeni negatif bir etkiye işaret etmektedir. Bu, yaş arttıkça kadınların saatlik ücretinin azaldığına işaret edebilir.

Censored Model:

```
data(Aids2) #loading data
model <- survreg(Surv(death, death >= 9000) ~ age + sex, data = Aids2, dist = "gaussian")
summary(model)
Call:
survreg(formula = Surv(death, death >= 9000) ~ age + sex, data = Aids2,
    dist = "gaussian")
                Value Std. Error
(Intercept)
             1.10e+04
                        7.83e+01 140.51 <2e-16
            -3.07e+00
                        1.15e+00 -2.68 0.0074
age
sexM
             1.17e+02
                        6.59e+01
                                    1.78 0.0749
Log(scale)
                        1.33e-02 482.96 <2e-16
             6.42e+00
Scale= 612
Gaussian distribution
Loglik(model) = -22196.3
                         Loglik(intercept only) = -22201.5
    Chisq= 10.47 on 2 degrees of freedom, p= 0.0053
```

Sonuçlar, yaş ve cinsiyetin ölüm riski üzerindeki etkilerini göstermektedir. Cinsiyet değişkeninin, ölüm riskinde anlamlı bir etkiye sahip olduğu görülmüştür. Ayrıca, yaşın etkisinin de pozitif ve anlamlı olduğu tespit edilmiştir.

Number of Newton-Raphson Iterations: 2

n = 2843