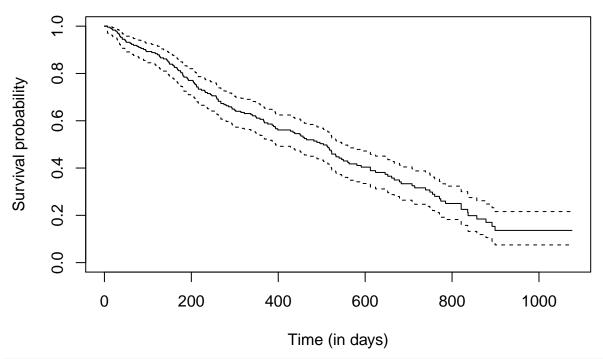
# BIOST537\_HW2

#### Joanna

1/27/2021

```
options(digits = 4)
knitr::opts_chunk$set(echo = TRUE)
# Load relevant packages
library(foreign)
library(survival)
library(flexsurv)
library(survMisc)
library(survminer)
## Loading required package: ggplot2
##
## Attaching package: 'ggplot2'
## The following object is masked from 'package:survMisc':
##
##
       autoplot
## Loading required package: ggpubr
# read in data
source("/Users/ziyuxiao/Desktop/UW/Winter2021/BIOST537/Discussion/code/getmedianres.R")
data <- read.csv("/Users/ziyuxiao/Desktop/UW/Winter2021/BIOST537/HW data/addicts.csv")</pre>
Problem 2(a)
s.data <- with(data, Surv(time, event == 1))</pre>
km.data <- survfit(s.data~1, conf.type="log-log")</pre>
plot(km.data,main="Kaplan-Meier survivor estimate",
     ylab="Survival probability",xlab="Time (in days)")
```

## Kaplan-Meier survivor estimate



```
summary(km.data,times = 365)
## Call: survfit(formula = s.data ~ 1, conf.type = "log-log")
```

## ## time n.risk n.event survival std.err lower 95% CI upper 95% CI ## 365 122 87 0.606 0.0331 0.538 0.667

(a) The estimated probability that no exit will occur by one year is 0.606, and 95%CI is (0.538, 0.667).

#### Problem 2(b)

```
# by hand
# estimate is 504
summary(km.data,times = 500:520)
## Call: survfit(formula = s.data ~ 1, conf.type = "log-log")
##
##
    time n.risk n.event survival std.err lower 95% CI upper 95% CI
                     107
##
     500
              92
                             0.503
                                    0.0346
                                                    0.434
                                                                  0.569
##
     501
              92
                       0
                             0.503
                                    0.0346
                                                    0.434
                                                                  0.569
##
     502
              92
                       0
                             0.503
                                    0.0346
                                                    0.434
                                                                  0.569
##
     503
              92
                       0
                             0.503
                                    0.0346
                                                    0.434
                                                                  0.569
##
     504
              92
                       1
                             0.498
                                    0.0346
                                                    0.428
                                                                  0.563
##
     505
              91
                       0
                             0.498
                                    0.0346
                                                    0.428
                                                                  0.563
##
     506
              91
                       0
                             0.498
                                    0.0346
                                                    0.428
                                                                  0.563
##
     507
              91
                       0
                             0.498
                                    0.0346
                                                    0.428
                                                                  0.563
##
     508
              91
                       0
                             0.498
                                    0.0346
                                                    0.428
                                                                  0.563
             91
##
     509
                       0
                             0.498
                                    0.0346
                                                    0.428
                                                                  0.563
##
     510
              91
                       0
                             0.498
                                    0.0346
                                                    0.428
                                                                  0.563
##
     511
              91
                             0.498 0.0346
                                                    0.428
                                                                  0.563
```

```
##
     512
                             0.492 0.0347
                                                    0.423
                                                                   0.558
                        1
##
     513
                        0
                             0.492 0.0347
                                                    0.423
                                                                   0.558
              90
                                                    0.417
##
     514
              90
                        1
                             0.487
                                    0.0347
                                                                   0.553
##
     515
              89
                        0
                             0.487
                                    0.0347
                                                    0.417
                                                                   0.553
##
     516
              89
                        0
                             0.487
                                    0.0347
                                                    0.417
                                                                   0.553
                             0.481
##
     517
              89
                        1
                                    0.0348
                                                    0.412
                                                                  0.547
                             0.476
                                    0.0348
##
     518
              87
                        1
                                                    0.406
                                                                   0.542
     519
##
              86
                        0
                             0.476
                                    0.0348
                                                    0.406
                                                                  0.542
##
     520
              86
                        0
                             0.476 0.0348
                                                    0.406
                                                                   0.542
# lower 95%CI is 394
summary(km.data,times = 393:400)
## Call: survfit(formula = s.data ~ 1, conf.type = "log-log")
##
##
    time n.risk n.event survival std.err lower 95% CI upper 95% CI
##
     393
             115
                       94
                             0.571
                                     0.0337
                                                    0.502
##
     394
             114
                        1
                             0.566
                                    0.0338
                                                    0.497
                                                                   0.629
     395
                        0
                             0.566
                                    0.0338
                                                    0.497
##
             112
                                                                   0.629
##
     396
                        0
                             0.566
                                    0.0338
                                                    0.497
                                                                   0.629
             112
##
     397
             112
                        0
                             0.566
                                    0.0338
                                                    0.497
                                                                   0.629
##
     398
             112
                        0
                             0.566
                                    0.0338
                                                    0.497
                                                                   0.629
##
     399
             112
                        1
                             0.561
                                    0.0339
                                                    0.492
                                                                   0.624
##
     400
             111
                        0
                             0.561
                                                    0.492
                                                                   0.624
                                    0.0339
# upper 95%CI is 550
summary(km.data,times = 540:550)
## Call: survfit(formula = s.data ~ 1, conf.type = "log-log")
##
    time n.risk n.event survival std.err lower 95% CI upper 95% CI
##
##
     540
              77
                      118
                             0.442
                                      0.035
                                                    0.372
                                                                   0.509
##
     541
              76
                        0
                             0.442
                                      0.035
                                                    0.372
                                                                   0.509
##
                        0
                             0.442
                                      0.035
                                                    0.372
                                                                  0.509
     542
              75
##
     543
              75
                        0
                             0.442
                                      0.035
                                                    0.372
                                                                  0.509
##
     544
              74
                        0
                             0.442
                                      0.035
                                                    0.372
                                                                  0.509
##
     545
              74
                        0
                             0.442
                                      0.035
                                                    0.372
                                                                  0.509
                                      0.035
##
     546
              74
                        1
                             0.436
                                                    0.366
                                                                  0.503
##
     547
              73
                        0
                             0.436
                                      0.035
                                                    0.366
                                                                   0.503
##
     548
              73
                        0
                             0.436
                                      0.035
                                                    0.366
                                                                   0.503
##
     549
              73
                        0
                             0.436
                                      0.035
                                                    0.366
                                                                   0.503
##
     550
              73
                        1
                             0.430
                                      0.035
                                                    0.361
                                                                   0.497
# second way
print(km.data)
## Call: survfit(formula = s.data ~ 1, conf.type = "log-log")
##
##
         n
             events
                     median 0.95LCL 0.95UCL
##
       238
                150
                         504
                                  394
                                          550
```

- (b)(i) The estimated median time until exit from maintenance is 504 days. 95%CI is (394, 550). Construct the interval that includes all values of t such that the test of H0: S(t)=0.5 is not rejected. Therefore, we can find the lower and higher bound from the results.
- (b)(ii) Using the print command. We can get the same results as above.

#### Problem 2(c)

```
km.data.by.incar <- survfit(s.data~prison,data=data,conf.type="log-log")</pre>
fit <- list(km.data,km.data.by.incar )</pre>
ggsurvplot_combine(fit,data,pval = TRUE,palette = "jco",
                    risk.table = FALSE,legend.labs = c("All","No","Yes"))
                                   1.00
Survival probability
0.50
0.25
   0.00
                                                                                1000
                                             500
                                                               750
            0
                            250
                                               Time
summary(km.data.by.incar,times = 240)
## Call: survfit(formula = s.data ~ prison, data = data, conf.type = "log-log")
##
                    prison=0
##
##
                       n.risk
                                                survival
                                                               std.err lower 95% CI
           time
                                   n.event
##
       240.0000
                      91.0000
                                   29.0000
                                                  0.7634
                                                                0.0384
                                                                             0.6776
   upper 95% CI
##
##
         0.8292
##
##
                    prison=1
                                                               std.err lower 95% CI
##
           time
                       n.risk
                                   n.event
                                                survival
                      62.0000
##
       240.0000
                                   35.0000
                                                  0.6555
                                                                0.0475
                                                                             0.5537
##
   upper 95% CI
##
         0.7395
sterr <- sqrt(0.0384^2+0.0475^2)
est <- 0.7634-0.6555
est/sterr
```

## [1] 1.767

(c)(ii) Since the test statistics is equal to 1.77 < 1.96, we fail to reject the null hypothesis that the probability

that no exit occurred by 8 months is not different from each other in the two groups.

```
survdiff(s.data~prison,data = data)
```

```
## Call:
## survdiff(formula = s.data ~ prison, data = data)
##
##
              N Observed Expected (O-E)^2/E (O-E)^2/V
                      81
                              87.8
## prison=0 127
                                       0.519
                                                   1.26
## prison=1 111
                       69
                              62.2
                                       0.732
                                                   1.26
##
    Chisq= 1.3 on 1 degrees of freedom, p= 0.3
```

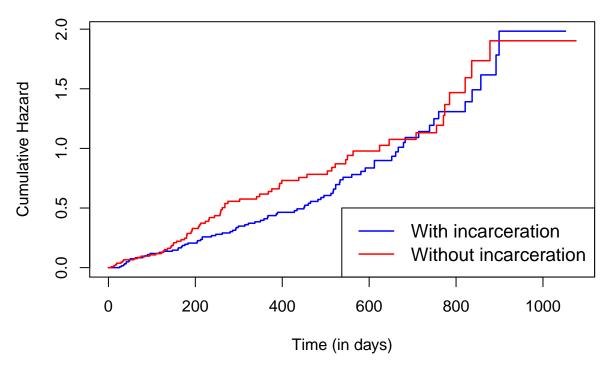
(c)(iii) Since p is equal to 0.3 > 0.05, we fail to reject the null hypothesis that the distribution of time until exit from maintenance is not different from each other.

#### comp(ten(km.data.by.incar))\$tests\$1rTests

```
##
                                      Z pNorm
                             Var
## 1
              6.75e+00 3.62e+01 1.122
## n
              1.43e+03 8.04e+05 1.600
                                            1
## sqrtN
              1.01e+02 4.86e+03 1.454
                                            3
## S1
              6.24e+00 1.69e+01 1.515
                                            2
                                            2
## S2
              6.21e+00 1.67e+01 1.519
## FH_p=1_q=1 8.59e-01 1.31e+00 0.749
                                            5
##
               maxAbsZ
                                     Q pSupBr
                             Var
## 1
              1.07e+01 3.62e+01 1.78
                                            5
## n
              1.81e+03 8.04e+05 2.02
                                            1
              1.39e+02 4.86e+03 1.99
                                            4
## sqrtN
## S1
              8.26e+00 1.69e+01 2.01
                                            3
                                            2
## S2
              8.21e+00 1.67e+01 2.01
                                            6
## FH_p=1_q=1 1.78e+00 1.31e+00 1.55
## NULL
```

(c)(iv) By looking at the Z statistics for Wilcoxon-Gehan-Breslow test, which is equal to 1.6 < 1.96, we therefore fail to reject the null hypothesis that the distribution of time until exit from maintenance is not different from each other.

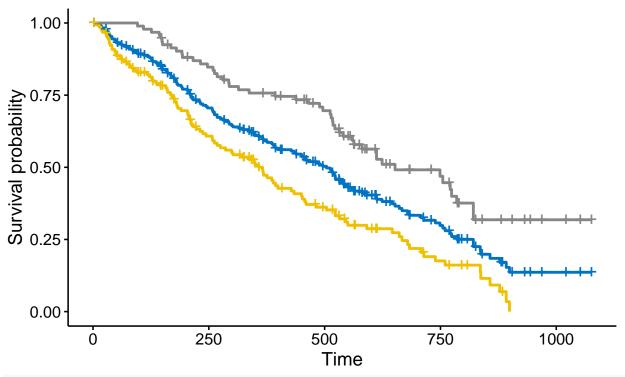
### **Nelson-Aalen Cumulative Hazard Estimates**



(c)(v) From the cumulative hazard estimates plot, the two groups cross over at some points. The logrank test has very little power against crossing hazard functions. We can use the weighted logrank test, such as the Wilcoxon-Gehan-Breslow test here if we consider the survival differences are meaningful at earlier times.

#### Problem 2(d)

#### Strata $\leftarrow$ All $\leftarrow$ <=60 $\leftarrow$ >60



```
summary(km.data.by.dose,times = 240)
```

```
## Call: survfit(formula = s.data ~ dose_binary, data = data, conf.type = "log-log")
##
##
                    dose_binary=0
##
           time
                       n.risk
                                    n.event
                                                survival
                                                               std.err lower 95% CI
                      76.0000
                                    51.0000
                                                                0.0425
                                                                              0.5272
##
       240.0000
                                                   0.6162
  upper 95% CI
##
##
         0.6934
##
##
                    dose_binary=1
##
                       n.risk
                                    n.event
                                                survival
                                                               std.err lower 95% CI
           time
                      77.0000
                                    13.0000
                                                                0.0365
                                                                              0.7682
##
       240.0000
                                                   0.8582
##
  upper 95% CI
         0.9151
sterr <- sqrt(0.0425^2+0.0365^2)
est <- 0.6162-0.8582
est/sterr
```

#### ## [1] -4.32

(d)(ii) Since the test statistics is equal to -4.32 < -1.96, we reject the null hypothesis that the probability that no exit occurred by 8 months is not different from each other in the two groups.

```
survdiff(s.data~dose_binary,data = data)
```

```
## Call:
## survdiff(formula = s.data ~ dose_binary, data = data)
##
```

```
## N Observed Expected (0-E)^2/E (0-E)^2/V ## dose_binary=0 145 102 71 13.6 26.5 ## dose_binary=1 93 48 79 12.2 26.5 ## ## Chisq= 26.5 on 1 degrees of freedom, p= 3e-07
```

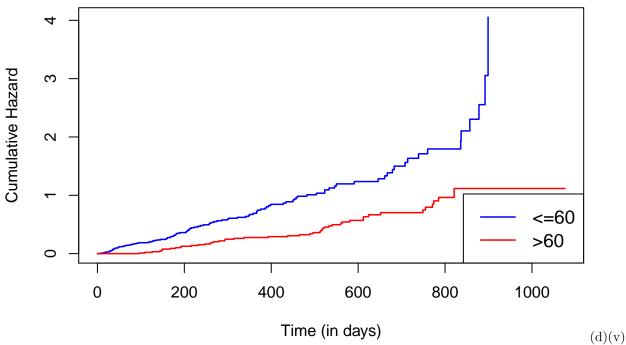
(d)(iii) Since p is equal to 3e-07 < 0.05, we reject the null hypothesis that the distribution of time until exit from maintenance is not different from each other.

```
comp(ten(survfit(s.data~dose_binary,data = data)))$tests$lrTests
```

```
##
                       Q
                                Var
                                         Z pNorm
## 1
                  -31.05
                              36.34 -5.15
                                               1
## n
                -4459.00 810346.87 -4.95
                                               5
                                               4
## sqrtN
                 -354.13
                            4922.56 -5.05
## S1
                  -20.91
                              17.11 -5.06
                                               3
                              16.88 -5.05
## S2
                  -20.73
                                               4
## FH_p=1_q=1
                   -4.76
                               1.34 -4.11
                                               2
##
                maxAbsZ
                              Var
                                     Q pSupBr
               3.11e+01 3.63e+01 5.15
                                             2
## 1
## n
               4.46e+03 8.10e+05 4.95
                                             1
               3.54e+02 4.92e+03 5.05
                                             5
## sqrtN
## S1
               2.09e+01 1.71e+01 5.06
                                             4
                                             5
## S2
               2.07e+01 1.69e+01 5.05
## FH_p=1_q=1 4.76e+00 1.34e+00 4.11
                                             3
## NULL
```

(d)(iv) By looking at the Z statistics for Wilcoxon-Gehan-Breslow test, which is equal to -4.95 < -1.96, we therefore reject the null hypothesis that the distribution of time until exit from maintenance is not different from each other.

### **Nelson-Aalen Cumulative Hazard Estimates**



From the cumulative hazard estimates plot, the two groups do not cross over all the time. We can directly use the logrank test here. It has enough power. And both the two tests have the similar results for the hypothesis testing.

#### Problem 2(e)

```
survdiff(s.data~prison+strata(clinic),data=data)
## survdiff(formula = s.data ~ prison + strata(clinic), data = data)
##
##
              N Observed Expected (0-E)^2/E (0-E)^2/V
  prison=0 127
                       81
                              92.7
                                        1.48
                                                   4.04
  prison=1 111
                       69
                              57.3
                                        2.40
                                                   4.04
##
    Chisq= 4 on 1 degrees of freedom, p= 0.04
survdiff(s.data~prison,data=data)
## Call:
## survdiff(formula = s.data ~ prison, data = data)
##
##
              N Observed Expected (O-E)^2/E (O-E)^2/V
## prison=0 127
                       81
                              87.8
                                       0.519
                                                   1.26
                       69
                              62.2
                                                   1.26
##
  prison=1 111
                                       0.732
##
    Chisq= 1.3 on 1 degrees of freedom, p= 0.3
```

The null hypothesis is that for either clinic 1 or clinic 2 group, the hazard is the same in prison group as in non-prison group.

The alternative hypothesis is that for either clinic 1 or clinic 2 group, the hazard is not the same in prison

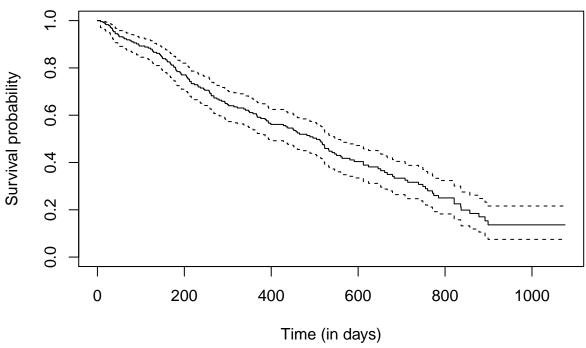
group as in non-prison group at some time t.

Since p is equal to 0.04 < 0.05. We reject the null hypothesis that the time until exit from maintenance is not different by history of previous incarceration adjusting for clinic membership.

In the standard logrank test, since p is equal to 0.3 > 0.05. We fail to reject the null hypothesis that the time until exit from maintenance is not different by history of previous incarceration.

#### Problem 2(f)

### Kaplan-Meier survivor estimate



```
summary(km.data,times = 120)
## Call: survfit(formula = s.data ~ 1, conf.type = "log-log")
##
##
    time n.risk n.event survival std.err lower 95% CI upper 95% CI
##
     120
            199
                      27
                            0.884
                                     0.021
                                                  0.835
                                                                0.919
0.884/2 #0.442
## [1] 0.442
summary(km.data,times = 530:550)
## Call: survfit(formula = s.data ~ 1, conf.type = "log-log")
##
##
    time n.risk n.event survival std.err lower 95% CI upper 95% CI
##
     530
             83
                     115
                                   0.0349
                                                  0.390
                            0.459
                                                                0.526
##
     531
             83
                       0
                            0.459
                                   0.0349
                                                  0.390
                                                                0.526
##
     532
             80
                       1
                            0.453
                                  0.0349
                                                  0.384
                                                                0.520
```

```
533
             78
                            0.448 0.0349
##
                                                  0.378
                                                                0.515
                       1
##
     534
             77
                            0.448 0.0349
                                                  0.378
                                                                0.515
                       0
     535
##
             77
                       0
                            0.448 0.0349
                                                  0.378
                                                                0.515
##
     536
             77
                            0.448 0.0349
                       0
                                                  0.378
                                                                0.515
##
     537
             77
                       0
                            0.448 0.0349
                                                  0.378
                                                                0.515
##
     538
             77
                       0
                            0.448 0.0349
                                                  0.378
                                                                0.515
##
     539
             77
                       0
                            0.448 0.0349
                                                  0.378
                                                                0.515
##
             77
                            0.442 0.0350
                                                                0.509
     540
                       1
                                                  0.372
##
     541
             76
                       0
                            0.442 0.0350
                                                  0.372
                                                                0.509
##
     542
             75
                       0
                            0.442 0.0350
                                                  0.372
                                                                0.509
##
     543
             75
                       0
                            0.442 0.0350
                                                  0.372
                                                                0.509
##
             74
     544
                       0
                            0.442 0.0350
                                                  0.372
                                                                0.509
                            0.442 0.0350
##
     545
             74
                       0
                                                  0.372
                                                                0.509
##
     546
             74
                            0.436 0.0350
                       1
                                                  0.366
                                                                0.503
##
     547
             73
                       0
                            0.436 0.0350
                                                  0.366
                                                                0.503
##
     548
             73
                       0
                            0.436 0.0350
                                                  0.366
                                                                0.503
##
     549
             73
                       0
                            0.436 0.0350
                                                  0.366
                                                                0.503
##
     550
             73
                            0.430 0.0350
                                                  0.361
                                                                0.497
# time is 540 days
# median residual time
540-120
## [1] 420
summary(km.data,times = 240)
## Call: survfit(formula = s.data ~ 1, conf.type = "log-log")
##
## time n.risk n.event survival std.err lower 95% CI upper 95% CI
     240
            153
                     64
                            0.715 0.0302
                                                  0.651
                                                                0.769
0.715/2 #0.3575
## [1] 0.3575
summary(km.data,times = 660:670)
## Call: survfit(formula = s.data ~ 1, conf.type = "log-log")
##
##
   time n.risk n.event survival std.err lower 95% CI upper 95% CI
##
     660
             46
                    129
                            0.365 0.0359
                                                  0.296
                                                                0.435
##
     661
             46
                            0.357 0.0359
                                                  0.288
                                                                0.428
                       1
##
     662
             45
                       0
                            0.357 0.0359
                                                  0.288
                                                                0.428
##
     663
             45
                       0
                            0.357 0.0359
                                                  0.288
                                                                0.428
##
     664
             45
                       0
                            0.357 0.0359
                                                  0.288
                                                                0.428
##
     665
                       0
                            0.357 0.0359
                                                                0.428
             45
                                                  0.288
##
     666
             45
                       0
                            0.357 0.0359
                                                  0.288
                                                                0.428
##
     667
             45
                       1
                            0.350 0.0360
                                                  0.280
                                                                0.420
##
     668
             44
                       0
                            0.350 0.0360
                                                  0.280
                                                                0.420
##
     669
             44
                       0
                            0.350 0.0360
                                                  0.280
                                                                0.420
##
     670
                       0
                            0.350 0.0360
                                                  0.280
                                                                0.420
             44
# time is 667
# median residual time
667-240
```

## [1] 427

```
summary(km.data,times = 365)
## Call: survfit(formula = s.data ~ 1, conf.type = "log-log")
##
##
    time n.risk n.event survival std.err lower 95% CI upper 95% CI
##
     365
            122
                      87
                             0.606 0.0331
                                                   0.538
                                                                 0.667
0.606/2 #0.303
## [1] 0.303
summary(km.data,times = 730:750)
   Call: survfit(formula = s.data ~ 1, conf.type = "log-log")
##
##
    time n.risk n.event survival std.err lower 95% CI upper 95% CI
             36
##
     730
                     135
                             0.316 0.0362
                                                   0.247
                                                                 0.388
##
     731
             35
                       0
                             0.316 0.0362
                                                   0.247
                                                                 0.388
##
     732
                       0
                             0.316 0.0362
             35
                                                   0.247
                                                                 0.388
##
     733
             35
                       0
                             0.316
                                    0.0362
                                                   0.247
                                                                 0.388
##
     734
             35
                       0
                             0.316
                                   0.0362
                                                   0.247
                                                                 0.388
##
     735
             35
                       0
                             0.316
                                   0.0362
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     736
             35
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##
     737
             35
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     738
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##
             35
                             0.307
                                   0.0363
                                                   0.238
     739
                       1
                                                                 0.379
     740
##
             34
                       0
                             0.307
                                    0.0363
                                                   0.238
                                                                 0.379
##
     741
             34
                       0
                             0.307
                                   0.0363
                                                   0.238
                                                                 0.379
##
                       0
                             0.307
                                   0.0363
     742
             34
                                                   0.238
                                                                 0.379
##
     743
             34
                       0
                             0.307
                                   0.0363
                                                   0.238
                                                                 0.379
##
     744
             34
                       0
                             0.307
                                   0.0363
                                                   0.238
                                                                 0.379
##
     745
             34
                       0
                             0.307
                                   0.0363
                                                   0.238
                                                                 0.379
##
     746
             34
                       0
                             0.307
                                   0.0363
                                                   0.238
                                                                 0.379
##
     747
             34
                       0
                             0.307
                                   0.0363
                                                   0.238
                                                                 0.379
##
     748
             34
                       0
                             0.307
                                    0.0363
                                                   0.238
                                                                 0.379
##
     749
             34
                             0.298
                       1
                                   0.0363
                                                   0.229
                                                                 0.370
##
     750
             33
                       0
                             0.298
                                   0.0363
                                                   0.229
                                                                 0.370
# time is 749
# median residual time
749-365
```

#### ## [1] 384

The estimated median residual time is 420, 427, 384 respectively.

```
m1 <- getmedianres(survobj = s.data, times = 120, confint = TRUE)
m2 <- getmedianres(survobj = s.data, times = 240, confint = TRUE)
m3 <- getmedianres(survobj = s.data, times = 365, confint = TRUE)</pre>
```

The estimated median residual time until exit from maintenance at 120 days is 420. The estimated median residual time until exit from maintenance at 240 days is 427. The estimated median residual time until exit from maintenance at 365 days is 384. The 95% CI are [376, 532],[341, 515], [296, 456] respectively.