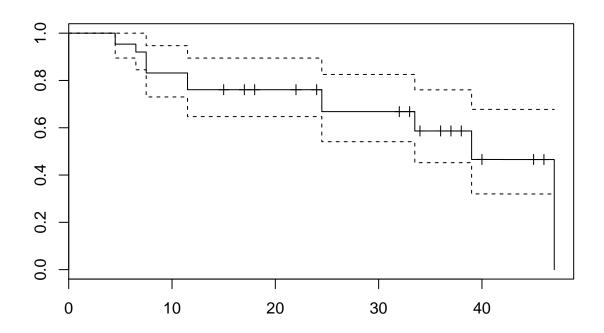
## Left\_and\_right\_and\_interval\_censoring\_with\_survfit.R

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```
library(survival)
# The survfit function of the standard survival package can handle left and right
# censored data as well as interval censored data. See the help of Surv, which
# mentions the following:
# The second approach is to think of each observation as a time interval with
# (-infinity, t) for left censored, (t, infinity) for right censored, (t,t) for
# exact and (t1, t2) for an interval. This is the approach used for type = interval2.
# Infinite values can be represented either by actual infinity (Inf) or NA. The
# second form has proven to be the more useful one.
# This is the small example shown during the lecture, and also written up on
# Blackboard. It has probability of event in (2,3] equal to 2/3, and probability
# of event in (4,5] equal to 1/3. Apparently, survfit assigns the probability mass
# in the middle of the intervals, so the survival function goes from 1 to 1/3
# halfway (2,3], and then the final step of 1/3 to 0 halfway (4,5].
test <- data.frame(start=c(0,1,2,4), stop=c(3,5,4,6), status=c(1,1,1,1))
Surv(test$start, test$stop, type='interval2')
## [1] [0, 3] [1, 5] [2, 4] [4, 6]
fit <- survfit(Surv(start, stop, type='interval2') ~ 1,data=test)</pre>
summary(fit)
## Call: survfit(formula = Surv(start, stop, type = "interval2") ~ 1,
##
       data = test)
##
## time n.risk n.event survival std.err lower 95% CI upper 95% CI
##
     2.5
           4.00
                   2.67
                           0.333
                                   0.236
                                                0.0834
                                                                  1
     4.5
           1.33
                   1.33
                           0.000
##
                                     NaN
                                                    NA
                                                                 NA
# Also the larger data set on breast cancer deteration discussed in
# Klein & Moeschberger and the lecture can be fitted with this.
library(KMsurv)
data(bcdeter)
bcdeter1 <- subset(bcdeter, treat==1)</pre>
head(bcdeter)
##
     lower upper treat
## 1
        0
               5
               7
## 2
         0
## 3
         0
               8
                     1
## 4
         4
              11
                     1
## 5
         5
            11
                     1
## 6
              12
```

```
Surv(bcdeter$lower, bcdeter$upper, type='interval2')
    [1] [0, 5] [0, 7] [0, 8] [4, 11] [5, 11] [5, 12] [6, 10]
   [8] [7, 14] [7, 16] [11, 15] [11, 18] [17, 25] [17, 25] [18, 26]
## [15] [19, 35] [25, 37] [26, 40] [27, 34] [36, 44] [36, 48] [37, 44]
## [22] [ 0, 5] [ 0, 22] [ 4, 8] [ 4, 9] [ 5, 8] [ 8, 12] [ 8, 21]
## [29] [10, 17] [10, 35] [11, 13] [11, 17] [11, 20] [12, 20] [13, 39]
## [36] [14, 17] [14, 19] [15, 22] [16, 20] [16, 24] [16, 24] [16, 60]
## [43] [17, 23] [17, 26] [17, 27] [18, 24] [18, 25] [19, 32] [22, 32]
## [50] [24, 30] [24, 31] [30, 34] [30, 36] [33, 40] 34
                                                               [35, 39]
## [57] [44, 48] 48
                          15+
                                   17+
                                            18+
                                                     22+
                                                               24+
## [64] 24+
                 32+
                          33+
                                   34+
                                            36+
                                                     36+
                                                               37+
## [71] 37+
                 37+
                          38+
                                   40+
                                            45+
                                                     46+
                                                               46+
## [78] 46+
                 46+
                          46+
                                   46+
                                            46+
                                                     46+
                                                               11+
## [85] 11+
                 13+
                          13+
                                   13+
                                            21+
                                                     23+
                                                               31+
## [92] 32+
                                   35+
                 34+
                          34+
fit <- survfit(Surv(lower, upper, type='interval2') ~ 1, data=bcdeter1)</pre>
summary(fit)
## Call: survfit(formula = Surv(lower, upper, type = "interval2") ~ 1,
##
       data = bcdeter1)
##
##
   time n.risk n.event survival std.err lower 95% CI upper 95% CI
    4.5 46.000 2.13e+00
                            0.954 0.0310
                                                 0.895
                                                               1.000
##
                                                               1.000
##
    6.5 43.868 1.54e+00
                            0.920 0.0399
                                                 0.845
    7.5 42.332 4.08e+00
                            0.832 0.0552
                                                 0.730
                                                              0.947
##
##
  11.5 38.255 3.25e+00
                            0.761 0.0629
                                                 0.647
                                                              0.895
##
   17.5 33.000 9.07e-04
                            0.761
                                   0.0629
                                                 0.647
                                                               0.895
##
   24.5 28.999 3.53e+00
                            0.668 0.0720
                                                 0.541
                                                              0.825
## 25.5 25.469 3.11e-08
                            0.668 0.0720
                                                 0.541
                                                              0.825
## 33.5 23.469 2.87e+00
                            0.586 0.0777
                                                 0.452
                                                              0.760
## 34.5 19.596 1.85e-10
                            0.586 0.0777
                                                 0.452
                                                              0.760
## 36.5 17.596 1.43e-04
                            0.586
                                  0.0777
                                                 0.452
                                                              0.760
## 39.0 13.596 2.79e+00
                            0.466
                                   0.0891
                                                 0.320
                                                               0.678
## 42.0 9.801 6.71e-03
                            0.466
                                                 0.320
                                                               0.678
                                   0.0891
## 47.0 0.794 7.94e-01
                            0.000
                                      NaN
                                                    NA
                                                                 NA
plot(fit)
```

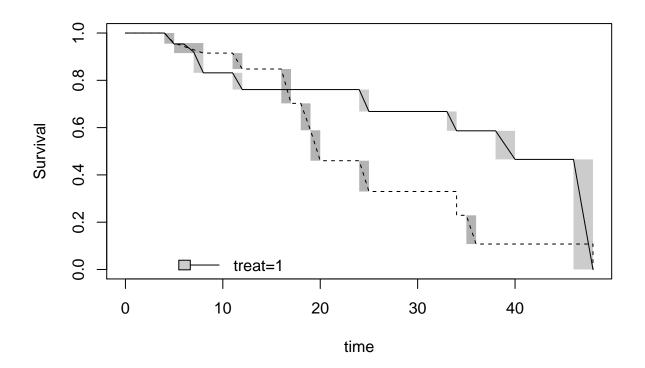


```
# A nice package for non-parametric estimation of interval censorerd data is the
# interval package. Here is a similar fit, where the Turnbull intervals are nicely
# shown.
library(interval)
fit1 <- icfit(Surv(lower, upper, type = "interval2") ~ treat, data = bcdeter)
summary(fit1)</pre>
```

```
## treat=1:
##
     Interval Probability
## 1
        (4,5]
                    0.0463
                     0.0334
## 2
        (6,7]
## 3
        (7,8]
                     0.0887
## 4
     (11, 12]
                     0.0708
## 5
      (24, 25]
                     0.0926
## 6
      (33,34]
                     0.0818
## 7
      (38,40]
                     0.1209
## 8
      (46,48]
                     0.4656
## treat=2:
##
      Interval Probability
## 1
          (4,5]
                      0.0424
## 2
          (5,8]
                      0.0424
## 3
       (11, 12]
                      0.0673
## 4
                      0.1453
        (16, 17]
## 5
        (18, 19]
                      0.1138
## 6
        (19,20]
                      0.1288
## 7
       (24, 25]
                      0.1302
```

```
## 8 [34,34] 0.1007
## 9 (35,36] 0.1215
## 10 [48,48] 0.1076
```

## plot(fit1)



```
# Finally, the left and right censoring example of yesterday
# Results are not exactly the same, because of the way that survfit puts
# the time points of interval censored observations in the middle of the
# (Turnbull) intervals
mar<-matrix(c(10:19,4,12,19,24,20,13,3,1,0,4,0,0,2,15,24,18,14,6,0,0,0,0,0,1,2,3,2,3,1,0),ncol=4)
colnames(mar)<-c("Age","N.ExactOb", "N.YetToSmoke","N.StartedToSmoke");
mar<-data.frame(mar)
mar</pre>
```

##		Age	N.ExactOb	N.YetToSmoke	N.StartedToSmoke
##	1	10	4	0	0
##	2	11	12	0	0
##	3	12	19	2	0
##	4	13	24	15	1
##	5	14	20	24	2
##	6	15	13	18	3
##	7	16	3	14	2
##	8	17	1	6	3
##	9	18	0	0	1
##	10	19	4	0	0

```
# In order to use this second approach, we have to make separate lines (with weights)
# to represent all possibilities.
# First the first column of exact observations. They will be represented by the
# intervals (t,t).
marexact <- data.frame(lower=10:19, upper=10:19, n=mar$N.ExactOb)</pre>
marexact
      lower upper n
##
## 1
              10 4
         10
## 2
         11
               11 12
## 3
         12
              12 19
## 4
         13
              13 24
## 5
              14 20
         14
## 6
              15 13
        15
## 7
         16
              16 3
## 8
              17 1
         17
## 9
         18
              18 0
## 10
        19
              19 4
# The left censored observations will be represented by (-Inf, t]
marleft <- data.frame(lower=-Inf, upper=10:19, n=mar$N.StartedToSmoke)</pre>
marleft
##
      lower upper n
## 1
      -Inf
              10 0
## 2
      -Inf
              11 0
## 3
      -Inf
              12 0
## 4
      -Inf
             13 1
              14 2
## 5
      -Inf
## 6
      -Inf
             15 3
## 7
      -Inf
             16 2
## 8
     -Inf
              17 3
## 9
      -Tnf
              18 1
## 10 -Inf
             19 0
# And finally the right censored observations are represented by (t, Inf]
marright <- data.frame(lower=10:19, upper=Inf, n=mar$N.YetToSmoke)</pre>
marright
##
      lower upper n
## 1
             Inf 0
         10
## 2
         11
              Inf 0
## 3
              Inf 2
         12
## 4
             Inf 15
         13
## 5
             Inf 24
         14
## 6
         15
             Inf 18
## 7
         16
              Inf 14
## 8
         17
             Inf 6
## 9
         18 Inf 0
## 10
        19 Inf 0
```

```
# Gather everything and throw away the empty cells
mardata <- rbind(marexact, marleft, marright)</pre>
mardata <- subset(mardata, n>0)
mardata
##
      lower upper n
## 1
         10
              10 4
## 2
         11
              11 12
## 3
         12
              12 19
## 4
         13
              13 24
## 5
         14
              14 20
## 6
              15 13
         15
## 7
         16
              16 3
## 8
         17
              17 1
## 10
         19
              19 4
## 14 -Inf
              13 1
## 15 -Inf
              14 2
## 16 -Inf
              15 3
## 17 -Inf
              16 2
              17 3
## 18 -Inf
## 19
     -Inf
              18 1
## 23
              Inf 2
         12
## 24
             Inf 15
         13
## 25
         14
             Inf 24
## 26
             Inf 18
         15
## 27
              Inf 14
         16
## 28
         17
              Inf 6
# And finally, fit with survfit
fit <- survfit(Surv(lower, upper, type='interval2') ~ 1, data=mardata, weights=n)</pre>
summary(fit)
## Call: survfit(formula = Surv(lower, upper, type = "interval2") ~ 1,
##
       data = mardata, weights = n)
##
           n.risk n.event survival std.err lower 95% CI upper 95% CI
## 10.0 191.0000 4.4880 0.976503 0.01096
                                                              0.998
                                              9.55e-01
## 11.0 186.5120 13.4640 0.906010 0.02111
                                              8.66e-01
                                                              0.948
                                                              0.854
## 12.0 173.0480 21.3180 0.794398 0.02924
                                              7.39e-01
## 13.0 151.7300 27.3322 0.651297 0.03448
                                              5.87e-01
                                                              0.723
## 14.0 124.3978 25.8894 0.515751 0.03616
                                              4.50e-01
                                                              0.592
## 15.0 98.5084 23.6147 0.392114 0.03533
                                              3.29e-01
                                                              0.468
## 16.0 74.8937 8.9272 0.345375 0.03441
                                                              0.420
                                              2.84e-01
## 17.0 65.9665 7.1124 0.308137 0.03341
                                              2.49e-01
                                                              0.381
## 17.5 58.8541 0.1508 0.307347 0.03339
                                              2.48e-01
                                                              0.380
## 19.0 58.7033 58.6221 0.000426 0.00149
                                              4.41e-07
                                                              0.411
     Inf 0.0813 0.0813 0.000000
                                      NaN
                                                    NA
                                                                 NA
plot(fit, xlim=c(0,20))
```

