BIOS 6301: Assignment 6

Charlie Rhea

Due Tuesday, 24 October, 1:00 PM $5^{n=day}$ points taken off for each day late.

40 points total.

Submit a single knitr file (named homework6.rmd), along with a valid PDF output file. Inside the file, clearly indicate which parts of your responses go with which problems (you may use the original homework document as a template). Add your name as author to the file's metadata section. Raw R code/output or word processor files are not acceptable.

Failure to name file homework6.rmd or include author name may result in 5 points taken off.

Question 1

16 points

Obtain a copy of the football-values lecture. Save the five 2023 CSV files in your working directory.

Modify the code to create a function. This function will create dollar values given information (as arguments) about a league setup. It will return a data.frame and write this data.frame to a CSV file. The final data.frame should contain the columns 'PlayerName', 'pos', 'points', 'value' and be ordered by value descendingly. Do not round dollar values.

Note that the returned data.frame should have sum(posReq)*nTeams rows.

Define the function as such (10 points):

```
# path: directory path to input files
# file: name of the output file; it should be written to path
# nTeams: number of teams in league
# cap: money available to each team
# posReq: number of starters for each position
# points: point allocation for each category
path = '/Users/charlesrhea/Desktop/BIOS 6301 - Introduction to Statistical Computing/#Homework Assignment
ffvalues <- function(path, file='outfile.csv', nTeams=12, cap=200, posReq=c(qb=1, rb=2, wr=3, te=1, k=1
                     points=c(fg=4, xpt=1, pass_yds=1/25, pass_tds=4, pass_ints=-2,
                              rush_yds=1/10, rush_tds=6, fumbles=-2, rec_yds=1/20, rec_tds=6)) {
#1: Read in the 5 CSV files
positions = c('k','qb','rb','te','wr')
csvfile = paste('proj_', positions,'23.csv', sep='')
datafiles = file.path(path, csvfile)
names(datafiles) = positions
k = read.csv(datafiles['k'])
```

```
qb = read.csv(datafiles['qb'])
rb = read.csv(datafiles['rb'])
te = read.csv(datafiles['te'])
wr = read.csv(datafiles['wr'])
#2: Calculate Dollar Values
#Merge into 1 dataset
cols = unique(c(names(k), names(qb), names(rb), names(te), names(wr), "pos"))
k[, setdiff(cols, names(k))] = 0
k$pos = "k"
qb[, setdiff(cols, names(qb))] = 0
qb$pos = "qb"
rb[, setdiff(cols, names(rb))] = 0
rb$pos = "rb"
te[, setdiff(cols, names(te))] = 0
te$pos = "te"
wr[, setdiff(cols, names(wr))] = 0
wr$pos = "wr"
x = rbind(k[,cols], qb[,cols], rb[,cols], te[,cols], wr[,cols])
#3 Calculate Points per Player
for (i in 1:length(points)){
 x[, paste("p_", names(points[i]), sep ='')] = x[, names(points[i])] * points[i]
x$points = rowSums(x[ , grep("^p_", names(x))])
#4 Calculating Player Value
#Rank players by points
x = x[order(x[,'points'], decreasing=TRUE),]
#Calculate marginal points by position
x$marg = NA
for (i in 1:length(names(posReq))){
  if (posReq[i] != 0){
x$marg[which(x$pos == names(posReq)[i])] = x$points[which(x$pos == names(posReq)[i])] - x$points[which(
#Drop negative/missing marginal points
x = na.omit(x)
x2 = x[x$marg >= 0,]
#Order by marginal points
x2 = x2[order(x2[,'marg'], decreasing=TRUE),]
#Calculate dollar value (from Lecture #1)
rownames(x2) <- NULL
x2$value = ((cap*nTeams) - (nTeams*sum(posReq))) * (x2$marg/sum(x2$marg)) + 1
#Final data.frame with needed information
x3 = x2[,c('PlayerName','pos','points', 'value')]
```

```
#Save as CSV file
write.csv(x3, file = file)

#Return data.frame with dollar values
return(x3)
}
```

- 1. Call x1 <- ffvalues('.')
 - 1. How many players are worth more than \$20? (1 point) 44 players are worth more than \$20

```
x1 <- ffvalues('.')
sum(x1$value>20)
```

[1] 44

2. Who is 15th most valuable running back (rb)? (1 point) Kenneth Walker III

```
x1$PlayerName[which(x1$pos == 'rb')[15]]
```

[1] "Kenneth Walker III"

- 2. Call x2 <- ffvalues(getwd(), '16team.csv', nTeams=16, cap=150)
 - 1. How many players are worth more than \$20? (1 point) 46 players are worth more than \$20

```
x2 <- ffvalues(getwd(), '16team.csv', nTeams=16, cap=150)
sum(x2$value>20)
```

[1] 46

2. How many wide receivers (wr) are in the top 40? (1 point) 11 wide receivers are in the top 40

```
sum(which(x2$pos == 'wr')<41)</pre>
```

[1] 11

3. Call:

1. How many players are worth more than \$20? (1 point) 39 players are worth more than \$20

```
sum(x3$value>20)
```

[1] 39

2. How many quarterbacks (qb) are in the top 30? (1 point) 17 quarterbacks are in the top 40

```
sum(which(x3$pos == 'qb')<30)
## [1] 17</pre>
```

Question 2

24 points

Import the HAART dataset (haart.csv) from the GitHub repository into R, and perform the following manipulations: (4 points each)

```
library(readr)
haart.ds <- read_csv("~/Desktop/BIOS 6301 - Introduction to Statistical Computing/datasets/haart.csv")

## Rows: 1000 Columns: 12

## -- Column specification -------

## Delimiter: ","

## chr (4): init.reg, init.date, last.visit, date.death

## dbl (8): male, age, aids, cd4baseline, logvl, weight, hemoglobin, death

##

## i Use 'spec()' to retrieve the full column specification for this data.

## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.</pre>

View(haart.ds)
```

1. Convert date columns into a usable (for analysis) format. Use the table command to display the counts of the year from init.date.

```
haart.ds\$init.date <- as.Date(haart.ds\$init.date, "\m/\%d/\%y")
haart.ds\$last.visit <- as.Date(haart.ds\$last.visit, "\m/\%d/\%y")
haart.ds\$date.death <- as.Date(haart.ds\$date.death, "\m/\%d/\%y")
haart.ds\$years <- format(haart.ds\$init.date, format = "\%Y")
table(haart.ds\$years)
```

2. Create an indicator variable (one which takes the values 0 or 1 only) to represent death within 1 year of the initial visit. How many observations died in year 1? 92 observations died in year 1

```
haart.ds\$oneyeardeath_years <- difftime(haart.ds\$date.death, haart.ds\$init.date, unit = "weeks")/52.25
haart.ds\$oneyeardeath_years <- as.numeric(haart.ds\$oneyeardeath_years)
haart.ds\$oneyeardeath_indi <- as.numeric(haart.ds\$oneyeardeath_years < 1)
table(haart.ds\$oneyeardeath_indi)
```

```
##
## 0 1
## 25 92
```

3. Use the init.date, last.visit and death.date columns to calculate a followup time (in days), which is the difference between the first and either the last visit or a death event (whichever comes first). If these times are longer than 1 year, censor them (this means if the value is above 365, set followup to 365). Print the quantile for this new variable. See output below

```
#Collapse the last.visit and death.date into a single column and take the value of the date that occurr
haart.ds\followup_refdate <- apply(haart.ds[,c(10,12)],1,min,na.rm = TRUE)
#Determine follow-up time from init.date to followup_refdate by number of days
haart.ds\followup_days <- round(difftime(haart.ds\followup_refdate, haart.ds\followup_tollowup_refdate, haart.ds
#Censor, or replace those with a follow-up time > 365 with the value 365; print quantiles of this varia
haart.ds\followup_daysCENSOR <- replace(haart.ds\followup_days, haart.ds\followup_days > 365, 365)
print(quantile(haart.ds$followup_daysCENSOR, na.rm = TRUE))
## Time differences in days
##
       0%
             25%
                    50%
                           75%
                                  100%
```

4. Create another indicator variable representing loss to followup; this means the observation is not known to be dead but does not have any followup visits after the first year. How many records are lost-to-followup? 173 records were lost to follow-up

```
#Create variable to indicate observations who are not known to be dead (death = 0) and whose follow-up
haart.ds$losstofollowup <- NA
haart.ds[haart.ds$death == 0 & haart.ds$followup_days < 365, "losstofollowup"] <- 1
table(haart.ds$losstofollowup)
##
```

5. Recall our work in class, which separated the init.reg field into a set of indicator variables, one for each unique drug. Create these fields and append them to the database as new columns. Which drug regimen are found over 100 times? Two regimens are found over 100 times - 3TC, AZT, and EVF (421 times), and 3TC, AZT, and NVP (284 times)

```
#Create a variable that contains a list to determine the number of times a regimen has be perscribed
init.reg <- as.character(haart.ds$init.reg)</pre>
(haart.ds[['init.reg_list']] <- strsplit(init.reg, ","))[1:3]</pre>
```

```
## [[1]]
## [1] "3TC" "AZT" "EFV"
## [[2]]
## [1] "3TC" "AZT" "EFV"
##
## [[3]]
## [1] "3TC" "AZT" "EFV"
```

##

##

1 ## 173

0.00 320.75 365.00 365.00 365.00

```
table(haart.ds$init.reg)
##
##
            3TC, ABC, AZT 3TC, ABC, AZT, LPV, RTV 3TC, ABC, AZT, RTV, SQV
                                                                                3TC, ABC, EFV
##
                                                                                           11
##
        3TC, ABC, IDV, RTV
                                   3TC, ABC, NVP
                                                          3TC, ABC, RTV
                                                                            3TC, ABC, RTV, SQV
##
                                   3TC, AZT, EFV
                                                     3TC, AZT, EFV, NFV
##
            3TC, AZT, DDI
                                                                            3TC, AZT, FPV, RTV
##
                                            421
            3TC, AZT, IDV
                              3TC, AZT, IDV, RTV
                                                     3TC, AZT, LPV, RTV
                                                                                3TC, AZT, NFV
##
##
                      12
                                                                    16
            3TC, AZT, NVP
                                                                            3TC, D4T, IDV, RTV
##
                              3TC, AZT, RTV, SQV
                                                          3TC, D4T, EFV
##
                     284
                                             13
                                                                    54
                                                                            3TC, D4T, RTV, SQV
##
        3TC, D4T, LPV, RTV
                                   3TC, D4T, NFV
                                                          3TC, D4T, NVP
##
                        2
                                              3
                                                                    61
            3TC, DDI, EFV
                              3TC, DDI, LPV, RTV
                                                          3TC, DDI, NVP
                                                                                 3TC, EFV, TDF
##
##
                       15
        3TC, FPV, RTV, TDF
                              3TC, LPV, RTV, TDF
                                                     ABC, ATV, DDI, RTV
                                                                                ABC, D4T, EFV
##
##
##
        ABC, D4T, LPV, RTV
                              ABC, D4T, RTV, SQV
                                                     ABC, DDI, LPV, RTV
                                                                            ATV, FTC, RTV, TDF
##
##
            AZT, DDI, EFV
                                   D4T, DDC, EFV
                                                          D4T, DDI, EFV
                                                                                D4T, DDI, NVP
                                                                                            2
                        2
##
            D4T, RTV, SQV
                                   DDI, EFV, FTC DDI, LPV, RTV, SQV, T20
                                                                                EFV, FTC, TDF
##
##
##
        FTC, LPV, RTV, TDF
                                   FTC, NVP, TDF
                                                         LPV, NVP, RTV
##
#Unlist to identify the name and total number of each unique drug
unlist(haart.ds$init.reg_list)[seq(50)]
    [1] "3TC" "AZT" "EFV" "3TC" "AZT" "EFV" "3TC" "AZT" "EFV" "3TC" "AZT" "EFV" "3TC" "AZT" "NVP"
   [13] "3TC" "D4T" "EFV" "3TC" "AZT" "NVP" "3TC" "AZT" "NVP" "3TC" "AZT" "EFV"
   [25] "3TC" "ABC" "AZT" "3TC" "DDI" "NVP" "3TC" "AZT" "NVP" "3TC" "AZT" "IDV"
## [37] "3TC" "AZT" "NVP" "3TC" "AZT" "EFV" "3TC" "AZT" "EFV" "3TC" "D4T" "NVP"
## [49] "3TC" "AZT"
(all_drugs <- unique(unlist(haart.ds$init.reg_list)))</pre>
   [1] "3TC" "AZT" "EFV" "NVP" "D4T" "ABC" "DDI" "IDV" "LPV" "RTV" "SQV" "FTC"
## [13] "TDF" "DDC" "NFV" "T20" "ATV" "FPV"
#Create a matrix (1000 rows for 1000 observations, and 18 variables for 18 unique drugs) to and search
reg_drugs <- matrix(0, nrow=nrow(haart.ds), ncol=length(all_drugs))</pre>
for(i in seq_along(all_drugs)) {
  reg_drugs[,i] <- sapply(haart.ds\u00e4init.reg_list, function(x) all_drugs[i] \u00c4in\u00e4 x)</pre>
}
#Martix results in a data frame to ease evaluation and allow for appending to original dataset
reg_drugs <- data.frame(reg_drugs)</pre>
names(reg_drugs) <- all_drugs</pre>
head(reg_drugs)
```

```
3TC AZT EFV NVP D4T ABC DDI IDV LPV RTV SQV FTC TDF DDC NFV T20 ATV FPV
## 1
         1
              1
                         0
                              0
                                   0
                                        0
                                             0
                                                        0
                                                             0
                                                                  0
                                                                        0
                                                                             0
                                                                                  0
                                                                                        0
                                                                                             0
                                                                                                  0
                   1
                                                   0
##
   2
         1
              1
                   1
                         0
                              0
                                   0
                                        0
                                              0
                                                   0
                                                        0
                                                             0
                                                                  0
                                                                        0
                                                                             0
                                                                                  0
                                                                                        0
                                                                                             0
                                                                                                  0
                                                                                                  0
## 3
              1
                   1
                         0
                              0
                                   0
                                        0
                                             0
                                                   0
                                                        0
                                                             0
                                                                  0
                                                                        0
                                                                             0
                                                                                  Ω
                                                                                        0
                                                                                             0
         1
##
   4
         1
              1
                   0
                         1
                              0
                                   0
                                        0
                                             0
                                                   0
                                                        0
                                                             0
                                                                  0
                                                                        0
                                                                             0
                                                                                  0
                                                                                        0
                                                                                             0
                                                                                                  0
              0
                                   0
                                        0
                                             0
                                                   0
                                                        0
                                                             0
                                                                  0
                                                                        0
                                                                             0
                                                                                       0
                                                                                                  0
## 5
                   1
                         0
                              1
                                                                                  0
                                                                                             0
         1
                   0
                         1
                              0
                                   0
                                                   0
                                                        0
                                                             0
                                                                  0
                                                                        0
                                                                                        0
                                                                                             0
                                                                                                  0
## 6
         1
              1
                                              0
```

```
#Appending drug data frame to original dataset
haart.ds_2 <- cbind(haart.ds, reg_drugs)
head(haart.ds_2)</pre>
```

```
##
     male age aids cd4baseline logvl
                                          weight hemoglobin
                                                                   init.reg
                                                                             init.date
## 1
            25
                   0
                               NA
                                      NA
                                               NA
                                                            NA 3TC, AZT, EFV 2003-07-01
         1
## 2
         1
            49
                   0
                              143
                                      NA 58.0608
                                                            11 3TC, AZT, EFV 2004-11-23
## 3
            42
                                      NA 48.0816
                                                             1 3TC, AZT, EFV 2003-04-30
         1
                   1
                              102
## 4
         0
            33
                   0
                              107
                                      NA 46.0000
                                                            NA 3TC, AZT, NVP 2006-03-25
                                       4
## 5
         1
            27
                   0
                               52
                                               NA
                                                            NA 3TC, D4T, EFV 2004-09-01
## 6
         0
            34
                              157
                                      NA 54.8856
                                                            NA 3TC, AZT, NVP 2003-12-02
                   0
     last.visit death date.death years oneyeardeath_years oneyeardeath_indi
##
                                      2003
## 1 2007-02-26
                      0
                               < NA >
                                                              NA
                                                                                  NA
## 2 2008-02-22
                      Λ
                               <NA>
                                      2004
                                                                                  NA
                                                              NA
## 3 2005-11-21
                      1 2006-01-11
                                      2003
                                                      2.6985646
                                                                                   0
## 4 2006-05-05
                        2006-05-07
                                      2006
                                                      0.1175666
                      1
                                                                                   1
## 5 2007-11-13
                      0
                               <NA>
                                      2004
                                                              NA
                                                                                  NA
## 6 2008-02-28
                               <NA>
                                      2003
                                                              NA
                      0
                                                                                  NA
##
     followup_refdate followup_days followup_daysCENSOR losstofollowup
## 1
            2007-02-26
                             1336 days
                                                     365 days
                                                     365 days
## 2
            2008-02-22
                             1186 days
                                                                            NA
## 3
            2005-11-21
                              936 days
                                                     365 days
                                                                             NA
## 4
            2006-05-05
                               41 days
                                                      41 days
                                                                             NA
## 5
            2007-11-13
                             1168 days
                                                     365 days
                                                                             NA
## 6
            2008-02-28
                             1549 days
                                                     365 days
                                                                             NA
##
     init.reg list 3TC AZT EFV
                                  NVP D4T ABC DDI
                                                     IDV
                                                         LPV RTV
                                                                  SQV FTC
                                                                           TDF
                                                                                DDC
                                                                                    NFV T20
## 1 3TC, AZT, EFV
                                         0
                                              0
                                                  0
                                                            0
                                                                0
                                                                     0
                                                                         0
                                                                              0
                                                                                  0
                            1
                                 1
                                                       0
                                                                                       0
                                                                                           0
                       1
                                     0
  2 3TC, AZT,
                            1
                                     0
                                         0
                                                   0
                                                            0
                                                                0
                                                                     0
                                                                         0
                                                                              0
                                                                                  0
                                                                                           0
                EFV
                       1
                                 1
                                              0
                                                       0
                                                                                       0
                                         0
                                                  0
                                                                0
                                                                     0
                                                                         0
                                                                                  0
## 3 3TC, AZT, EFV
                       1
                            1
                                 1
                                     0
                                              0
                                                       0
                                                            0
                                                                              0
                                                                                       0
                                                                                           0
                                                                     0
## 4 3TC, AZT,
                NVP
                       1
                            1
                                0
                                     1
                                         0
                                              0
                                                  0
                                                       0
                                                            0
                                                                0
                                                                         0
                                                                              0
                                                                                  0
                                                                                       0
                                                                                           0
## 5 3TC, D4T,
                EFV
                       1
                            0
                                 1
                                     0
                                         1
                                              0
                                                  0
                                                       0
                                                            0
                                                                0
                                                                     0
                                                                         0
                                                                              0
                                                                                  0
                                                                                       0
                                                                                           0
##
  6 3TC, AZT, NVP
                       1
                            1
                                 0
                                     1
                                         0
                                              0
                                                   0
                                                       0
                                                            0
                                                                0
                                                                     0
                                                                         0
                                                                              0
                                                                                  0
                                                                                       0
                                                                                           0
     ATV FPV
##
## 1
       0
            0
  2
            0
##
       0
##
   3
       0
            0
## 4
       0
            0
## 5
            0
       0
## 6
       0
            0
```

6. The dataset haart2.csv contains a few additional observations for the same study. Import these and append them to your master dataset (if you were smart about how you coded the previous steps, cleaning the additional observations should be easy!). Show the first five records and the last five records of the complete (and clean) data set. See head output for first 5 observations, and tail output for last 5 observations below

```
haart2.ds <- read_csv("~/Desktop/BIOS 6301 - Introduction to Statistical Computing/datasets/haart2.csv"
## Rows: 4 Columns: 12
## -- Column specification --------
## Delimiter: ","
## chr (3): init.reg, init.date, last.visit
## dbl (8): male, age, aids, cd4baseline, logvl, weight, hemoglobin, death
## lgl (1): date.death
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
haart_orig.ds <- read_csv("~/Desktop/BIOS 6301 - Introduction to Statistical Computing/datasets/haart.c
## Rows: 1000 Columns: 12
## Delimiter: ","
## chr (4): init.reg, init.date, last.visit, date.death
## dbl (8): male, age, aids, cd4baseline, logvl, weight, hemoglobin, death
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
final_haart.ds <- rbind(haart_orig.ds, haart2.ds)</pre>
View(final_haart.ds)
final_haart.ds\sinit.date <- as.Date(final_haart.ds\sinit.date,"\m/\%d/\%y")
final_haart.ds$last.visit <- as.Date(final_haart.ds$last.visit,"%m/%d/%y")
final_haart.ds$date.death <- as.Date(final_haart.ds$date.death,"%m/%d/%y")
final_haart.ds$oneyeardeath_years <- difftime(final_haart.ds$date.death, final_haart.ds$init.date, unit
final_haart.ds$oneyeardeath_years <- as.numeric(final_haart.ds$oneyeardeath_years)</pre>
final_haart.ds$oneyeardeath_indi <- as.numeric(final_haart.ds$oneyeardeath_years < 1)
final_haart.ds\followup_refdate <- apply(final_haart.ds[,c(10,12)],1,min,na.rm = TRUE)</pre>
final_haart.ds\followup_days <- round(difftime(final_haart.ds\followup_refdate, final_haart.ds\footnote{init.dat}
final_haart.ds$followup_daysCENSOR <- replace(final_haart.ds$followup_days, final_haart.ds$followup_day
final_haart.ds$losstofollowup <- NA</pre>
final_haart.ds[final_haart.ds$death == 0 & final_haart.ds$followup_days < 365, "losstofollowup"] <- 1
#Drug regimen, and indicator variables for each unique drug
init.reg <- as.character(final_haart.ds$init.reg)</pre>
(final_haart.ds[['init.reg_list']] <- strsplit(init.reg, ","))[1:3]</pre>
## [[1]]
## [1] "3TC" "AZT" "EFV"
##
## [[2]]
## [1] "3TC" "AZT" "EFV"
##
## [[3]]
## [1] "3TC" "AZT" "EFV"
```

```
unlist(final_haart.ds\$init.reg_list)[seq(50)]
   [1] "3TC" "AZT" "EFV" "3TC" "AZT" "EFV" "3TC" "AZT" "EFV" "3TC" "AZT" "NVP"
## [13] "3TC" "D4T" "EFV" "3TC" "AZT" "NVP" "3TC" "AZT" "NVP" "3TC" "AZT" "EFV"
## [25] "3TC" "ABC" "AZT" "3TC" "DDI" "NVP" "3TC" "AZT" "NVP" "3TC" "AZT" "IDV"
## [37] "3TC" "AZT" "NVP" "3TC" "AZT" "EFV" "3TC" "AZT" "EFV" "3TC" "AZT" "EFV" "3TC" "D4T" "NVP"
## [49] "3TC" "AZT"
(all_drugs <- unique(unlist(final_haart.ds\sinit.reg_list)))</pre>
## [1] "3TC" "AZT" "EFV" "NVP" "D4T" "ABC" "DDI" "IDV" "LPV" "RTV" "S0V" "FTC"
## [13] "TDF" "DDC" "NFV" "T20" "ATV" "FPV"
reg_drugs <- matrix(0, nrow=nrow(final_haart.ds), ncol=length(all_drugs))</pre>
for(i in seq_along(all_drugs)) {
  reg_drugs[,i] <- sapply(final_haart.ds\sinit.reg_list, function(x) all_drugs[i] \%in\% x)
reg_drugs <- data.frame(reg_drugs)</pre>
names(reg_drugs) <- all_drugs</pre>
head(reg_drugs)
     3TC AZT EFV NVP D4T ABC DDI IDV LPV RTV SQV FTC TDF DDC NFV T20 ATV FPV
## 1
       1
           1
                1
                        0
                            0
                                0
                                     0
                                             0
                                                          0
                                                              0
                                                                  0
## 2
       1
           1
                1
                    0
                        0
                            0
                                0
                                     0
                                         0
                                             0
                                                 0
                                                      0
                                                          0
                                                              0
                                                                  0
                                                                       0
                                                                           0
## 3
                        0
                                0
                                     0
                                                 0
                                                              0
                                                                  0
                                                                               0
## 4
       1
           1
                    1
                            0
                                         0
                                             0
                                                                           0
## 5
       1
           0
               1
                        1
## 6
               0
                        Λ
                                Λ
                                     Λ
                                         0
                                             0
                                                 Ω
       1
           1
                    1
final2_haart.ds <- cbind(final_haart.ds, reg_drugs)</pre>
head(final2_haart.ds, 5)
     male age aids cd4baseline logvl weight hemoglobin
                                                              init.reg init.date
##
                                                       NA 3TC, AZT, EFV 2003-07-01
## 1
                             NA
                                    NA
                                            NA
        1 49
                                    NA 58.0608
                                                        11 3TC, AZT, EFV 2004-11-23
## 2
                  0
                            143
## 3
        1 42
                            102
                                    NA 48.0816
                                                        1 3TC, AZT, EFV 2003-04-30
                 1
## 4
        0 33
                            107
                                    NA 46.0000
                                                        NA 3TC, AZT, NVP 2006-03-25
## 5
        1 27
                  0
                             52
                                                        NA 3TC, D4T, EFV 2004-09-01
                                     4
                                            NA
     last.visit death date.death oneyeardeath_years oneyeardeath_indi
##
## 1 2007-02-26
                     0
                             <NA>
                                                   NA
                                                                       NA
## 2 2008-02-22
                     0
                             <NA>
                                                                       NA
## 3 2005-11-21
                     1 2006-01-11
                                            2.6985646
                                                                        0
## 4 2006-05-05
                     1 2006-05-07
                                            0.1175666
                                                                        1
## 5 2007-11-13
                     0
                             <NA>
                                                                       NA
                                                   NA
     followup_refdate followup_days followup_daysCENSOR losstofollowup
           2007-02-26
## 1
                           1336 days
                                                 365 days
## 2
           2008-02-22
                           1186 days
                                                 365 days
                                                                        NA
## 3
           2005-11-21
                            936 days
                                                 365 days
                                                                        NA
           2006-05-05
## 4
                             41 days
                                                 41 days
                                                                        NA
## 5
           2007-11-13
                          1168 days
                                                365 days
                                                                        NA
```

```
init.reg_list 3TC AZT EFV NVP D4T ABC DDI IDV LPV RTV SQV FTC TDF DDC NFV T20
## 1 3TC, AZT, EFV
                           1
                                        0
                                            0
                                                 0
                                                     0
                                                         0
                                                              0
                                                                  0
                                                                       0
                                                                           0
                                                                               0
                                                                                    0
                                                                                        0
                      1
                               1
                                    0
                                        0
                                                          0
                                                                       0
                                                                               0
                                                                                        0
## 2 3TC, AZT, EFV
                                    0
                                                 0
                                                              0
                                                                  0
## 3 3TC, AZT, EFV
                                        0
                                                 0
                                                     0
                                                        0
                                                              0
                                                                  0
                                                                      0
                                                                           0
                                                                               0
                                                                                    0
                                                                                        0
                                   0
                                            0
                      1
                           1
                               1
## 4 3TC, AZT, NVP
                      1
                           1
                               0
                                   1
                                        0
                                            0
                                                0
                                                     0
                                                         0
                                                              0
                                                                  0
                                                                      0
                                                                           0
                                                                               0
                                                                                   0
                                                                                        0
## 5 3TC, D4T, EFV
                           0
                               1
                                   0
                                       1
                                            0
                                                0
                                                     0
                                                              0
                                                                  0
                                                                      0
                                                                               0
                                                                                   0
                                                                                        0
                      1
     ATV FPV
## 1
       0
           0
## 2
       0
           0
## 3
       0
           0
## 4
       0
           0
## 5
           0
       0
```

tail(final2_haart.ds, 5)

```
age aids cd4baseline
                                          logvl weight hemoglobin
        male
                                                                       init.reg
                                             NA 46.2672
## 1000
           0 40.00000
                         1
                                   131
                                                                 8 3TC, D4T, NVP
## 1001
           0 27.00000
                                   232
                                             NA
                                                                NA 3TC, AZT, NVP
                         0
                                                     NA
## 1002
           1 38.72142
                                   170
                                             NA 84.0000
                                                                NA 3TC, AZT, NVP
                         0
                                   154 3.995635 65.5000
                                                                14 3TC, DDI, EFV
## 1003
           1 23.00000
                        NA
## 1004
           0 31.00000
                         0
                                   236
                                             NA 45.8136
                                                                NA 3TC, D4T, NVP
         init.date last.visit death date.death oneyeardeath_years
## 1000 2003-07-03 2008-02-29
                                0
                                          <NA>
## 1001 2003-12-01 2004-01-05
                                  0
                                          <NA>
                                                                NA
## 1002 2002-09-26 2004-03-29
                                  0
                                          <NA>
                                                               NA
## 1003 2007-01-31 2007-04-16
                                  0
                                          <NA>
                                                               NA
## 1004 2003-12-03 2007-10-11
                                0
                                          <NA>
                                                               NA
        oneyeardeath_indi followup_refdate followup_days followup_daysCENSOR
## 1000
                                2008-02-29
                                               1702 days
                       NA
                                                                     365 days
## 1001
                                2004-01-05
                                                 35 days
                                                                     35 days
                       NA
## 1002
                                                                     365 days
                       NA
                                2004-03-29
                                                550 days
## 1003
                                2007-04-16
                       NΑ
                                                 75 days
                                                                     75 days
## 1004
                       NA
                                2007-10-11
                                               1408 days
                                                                     365 days
       losstofollowup init.reg_list 3TC AZT EFV NVP D4T ABC DDI IDV LPV RTV SQV
                   NA 3TC, D4T, NVP
                                                           0
## 1000
                                       1 0
                                              0
                                                   1
                                                       1
                                                                0
                                                                    0
                                                                        0
                                                                                0
## 1001
                    1 3TC, AZT, NVP
                                           1
                                               0
                                                       0
                                                           0
                                                                    0
                                                                        0
                                                                                0
                                                   1
                                                                0
                                       1
## 1002
                    NA 3TC, AZT, NVP
                                                                        0
                                           1
                                               0
                                                       0
                                                                                0
## 1003
                     1 3TC, DDI, EFV
                                       1
                                           0
                                               1
                                                   0
                                                       0 0 1
                                                                    0
                                                                      0 0
                                                                                0
## 1004
                    NA 3TC, D4T, NVP
                                       1
                                           0
                                               0
                                                   1
                                                       1
                                                          0
                                                               0
                                                                    0
                                                                        0 0
                                                                                0
##
       FTC TDF DDC NFV T20 ATV FPV
## 1000
              0
                  0
                      0
                          0
## 1001
              0
                  0
                      0
                          0
                                  0
          0
## 1002
         0
              0
                  0
                      0
                          0
                              0
                                 0
## 1003
          0
              0
                  0
                    0
                          0
                              0
                                 0
## 1004
                  0
                      0
                          0
                                0
```