# Bios 6301: Assignment 5

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## Grade 53/50

**Note:** In the future, for packages that might not be installed by collaborators, you can use the following to check for and install a package:

```
if("lubridate" %in% rownames(installed.packages()) == FALSE) {
  install.packages("lubridate",repos="http://cran.rstudio.com/")
}
```

Due Tuesday, 15 November, 1:00 PM

 $5^{n=day}$  points taken off for each day late.

17

60

270

292 207

50 points total.

Submit a single knitr file (named homework5.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 homework5.rmd or include author name may result in 5 points taken off.

Question 1

24 points

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

```
library(lubridate)
```

```
##
## Attaching package: 'lubridate'
## The following object is masked from 'package:base':
##
## date
haart <- read.csv("https://raw.githubusercontent.com/fonnesbeck/Bios6301/master/datasets/haart.csv")
haart[,'init.date']<- as.Date(haart[,'init.date'], format="%m/%d/%y")
haart[,'date.death']<- as.Date(haart[,'date.death'], format="%m/%d/%y")
haart[,'last.visit']<- as.Date(haart[,'last.visit'], format="%m/%d/%y")</pre>
```

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

```
haart[,'init.year'] <-format(haart[,'init.date'],'%Y')
table(haart[,'init.year'])

##
## 1998 2000 2001 2002 2003 2004 2005 2006 2007
```

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?

104

```
haart[, 'death1'] <- ifelse((haart[, 'date.death'] - haart[, 'init.date'] > 365 | is.na(haart[, 'date.d
sum(haart[, 'death1']==1)
```

## [1] 92

92 patients within 1 year

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.

```
haart[, 'follow.up'] <- ifelse(is.na(haart[, 'last.visit']), haart[, 'date.death'] - haart[, 'init.date
haart[, 'follow.up'][haart[, 'follow.up'] > 365] <- 365
quantile(haart[, 'follow.up'])
## 0% 25% 50% 75% 100%</pre>
```

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?

```
haart[,'lost'] <- ifelse(haart[,'death']==0 & haart[,'follow.up']==365,1,0)
table(haart[,'lost'])</pre>
```

##

710 records lost to follow up

0.00 320.75 365.00 365.00 365.00

### JC Grading -2

710 overcounts the answer of 173. Since follow-up time is truncated at 365, it includes many who had visits beyond the first year. You could check if anyone had a 365 visit and if not consider ltf those whose visit was less than 365.

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?

```
reg_list <- strsplit(as.character(haart[,'init.reg']),',')
all_drugs <- unique(unlist(reg_list))
reg_drugs <- matrix(nrow=nrow(haart), ncol=length(all_drugs))
for(i in seq_along(all_drugs)){
    reg_drugs[,i] <- +sapply(reg_list, function(x) all_drugs[i] %in% x)
}
colnames(reg_drugs) <- all_drugs
haart <- cbind(haart, reg_drugs)
reg_drugs<- as.data.frame(reg_drugs)
sapply(reg_drugs, sum)</pre>
```

```
## 3TC AZT EFV NVP D4T ABC DDI IDV LPV RTV SQV FTC TDF DDC NFV T20 ATV FPV ## 973 794 516 358 146 56 38 27 31 79 29 8 10 1 8 1 2 2 3TC, AZT, EFV, NVP, and D4T
```

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.

```
haart <- data.frame(read.csv("https://raw.githubusercontent.com/fonnesbeck/Bios6301/master/datasets/haa
haart2 <- data.frame(read.csv("https://raw.githubusercontent.com/fonnesbeck/Bios6301/master/datasets/ha
haart <- rbind(haart, haart2)</pre>
haart[,'init.date'] <- as.Date(haart[,'init.date'], format="%m/%d/%y")
haart[,'date.death'] <- as.Date(haart[,'date.death'], format="%m/%d/%y")
haart[,'last.visit'] <- as.Date(haart[,'last.visit'], format="%m/%d/%y")
haart[, 'death1'] <- ifelse((haart[, 'date.death'] - haart[, 'init.date'] > 365 | is.na(haart[, 'date.d
haart[, 'follow.up'] <- ifelse(is.na(haart[, 'last.visit']), haart[, 'date.death'] - haart[, 'init.date
haart[, 'follow.up'][haart[, 'follow.up'] > 365] <- 365</pre>
haart[,'lost'] <- ifelse(haart[,'death']==0 & haart[,'follow.up']==365,1,0)
reg_list <- strsplit(as.character(haart[,'init.reg']),',')</pre>
all_drugs <- unique(unlist(reg_list))</pre>
reg_drugs <- matrix(nrow=nrow(haart), ncol=length(all_drugs))</pre>
for(i in seq_along(all_drugs)){
    reg_drugs[,i] <- +sapply(reg_list, function(x) all_drugs[i] %in% x)</pre>
}
colnames(reg_drugs) <- all_drugs</pre>
haart <- cbind(haart, reg_drugs)
head(haart, n=5)
##
     male age aids cd4baseline logvl weight hemoglobin
                                                               init.reg
## 1
                                                         NA 3TC, AZT, EFV
                              NA
                                    NA
                                             NΑ
## 2
           49
                  0
                                    NA 58.0608
                                                         11 3TC, AZT, EFV
        1
                             143
## 3
           42
                             102
                                    NA 48.0816
                                                          1 3TC, AZT, EFV
        1
                  1
                             107
## 4
        0
           33
                  0
                                    NA 46.0000
                                                         NA 3TC, AZT, NVP
## 5
        1
           27
                  0
                              52
                                     4
                                             NA
                                                         NA 3TC, D4T, EFV
      init.date last.visit death date.death death1 follow.up lost 3TC AZT EFV
##
                                 0
                                                             365
## 1 2003-07-01 2007-02-26
                                          <NA>
                                                    0
                                                                     1
                                                                         1
                                                                             1
                                                                                 1
## 2 2004-11-23 2008-02-22
                                 0
                                                    0
                                                             365
                                                                         1
                                                                             1
                                                                                 1
                                          <NA>
                                                                     1
## 3 2003-04-30 2005-11-21
                                 1 2006-01-11
                                                    0
                                                             365
                                                                    0
                                                                         1
                                                                             1
                                                                                 1
## 4 2006-03-25 2006-05-05
                                 1 2006-05-07
                                                     1
                                                              41
                                                                    0
                                                                         1
                                                                             1
                                                                                 0
## 5 2004-09-01 2007-11-13
                                 0
                                          <NA>
                                                             365
                                                                                 1
                                                    0
                                                                    1
##
     NVP D4T ABC DDI IDV LPV RTV SQV FTC TDF DDC NFV
                                                         T20
                                                             ATV FPV
## 1
                0
                        0
                                 0
                                                               0
       0
           0
                    0
                             0
                                     0
                                          0
                                              0
                                                  0
                                                       0
                                                           0
                                                               0
## 2
       0
           0
                0
                    0
                        0
                             0
                                 0
                                     0
                                          0
                                              0
                                                  0
                                                       0
                                                           0
                                                                   0
## 3
       0
           0
                0
                    0
                        0
                             0
                                 0
                                     0
                                         0
                                              0
                                                  0
                                                       0
                                                           0
                                                               0
                                                                   0
## 4
           0
                0
                    0
                        0
                             0
                                 0
                                     0
                                          0
                                              0
                                                  0
                                                       0
                                                               0
                                                                   0
## 5
                                          0
                                                  0
       0
           1
                0
                    0
                        0
                             0
                                 0
                                     0
                                              0
                                                       0
                                                           0
                                                               0
                                                                   0
tail(haart, n=5)
                   age aids cd4baseline
                                             logvl weight hemoglobin
        male
## 1000
                                                NA 46.2672
           0 40.00000
                          1
                                     131
                                                                      8
## 1001
           0 27.00000
                          0
                                     232
                                                                    NA
## 1002
           1 38.72142
                          0
                                     170
                                                NA 84.0000
                                                                    NA
## 1003
           1 23.00000
                                     154 3.995635 65.5000
                                                                     14
                         NA
## 1004
           0 31.00000
                                     236
                                                NA 45.8136
                                                                    NA
                          0
            init.reg init.date last.visit death date.death death1 follow.up
## 1000 3TC,D4T,NVP 2003-07-03 2008-02-29
                                                          <NA>
                                                                    0
                                                                             365
                                                 0
## 1001 3TC,AZT,NVP 2003-12-01 2004-01-05
                                                                    0
                                                 0
                                                          <NA>
                                                                              35
## 1002 3TC,AZT,NVP 2002-09-26 2004-03-29
                                                 0
                                                          <NA>
                                                                    0
                                                                             365
## 1003 3TC,DDI,EFV 2007-01-31 2007-04-16
                                                 0
                                                          <NA>
                                                                    0
                                                                              75
```

```
## 1004 3TC,D4T,NVP 2003-12-03 2007-10-11
                                                              <NA>
                                                                          0
                                                                                   365
##
         lost 3TC AZT EFV NVP D4T ABC DDI IDV LPV RTV SQV FTC TDF DDC NFV T20
## 1000
                          0
                               1
                                    1
                                        0
                                             0
                                                 0
                                                      0
                                                               0
                                                                    0
                                                                                      0
                                                                                      0
## 1001
                          0
                                   0
                                        0
                                             0
                                                 0
                                                      0
                                                           0
                                                                    0
                                                                         0
                                                                             0
                                                                                  0
            0
                 1
                      1
                               1
                                                               0
## 1002
            1
                 1
                      1
                          0
                               1
                                   0
                                        0
                                             0
                                                 0
                                                      0
                                                           0
                                                               0
                                                                    0
                                                                         0
                                                                             0
                                                                                  0
                                                                                      0
## 1003
                                   0
                                        0
                                                 0
                                                      0
                                                           0
                                                               0
                                                                    0
                                                                             0
                                                                                      0
            0
                 1
                      0
                          1
                               0
                                             1
                                                                        0
                                                                                  0
                          0
## 1004
            1
                 1
                                                 0
                                                                                  0
         ATV FPV
##
## 1000
           0
                0
                0
## 1001
           0
## 1002
                0
## 1003
                0
## 1004
```

Question 2

14 points

Use the following code to generate data for patients with repeated measures of A1C (a test for levels of blood glucose).

```
genData <- function(n) {</pre>
if(exists(".Random.seed", envir = .GlobalEnv)) {
save.seed <- get(".Random.seed", envir= .GlobalEnv)</pre>
on.exit(assign(".Random.seed", save.seed, envir = .GlobalEnv))
} else {
on.exit(rm(".Random.seed", envir = .GlobalEnv))
}
set.seed(n)
subj <- ceiling(n / 10)</pre>
id <- sample(subj, n, replace=TRUE)</pre>
times <- as.integer(difftime(as.POSIXct("2005-01-01"), as.POSIXct("2000-01-01"), units='secs'))
dt <- as.POSIXct(sample(times, n), origin='2000-01-01')
mu <- runif(subj, 4, 10)
a1c <- unsplit(mapply(rnorm, tabulate(id), mu, SIMPLIFY=FALSE), id)
data.frame(id, dt, a1c)
}
x \leftarrow genData(500)
```

Perform the following manipulations: (2 points each)

Order the data set by id and dt.

```
x <- x[order(x$id,x$dt),]
```

For each id, determine if there is more than a one year gap in between observations. Add a new row at the one year mark, with the a1c value set to missing. A two year gap would require two new rows, and so forth.

```
gap.check <- function(identity,date){
  insert <- vector()
  new.row <- vector()
  for (i in unique(identity)){
    rows <- which(identity==i)[1:length(which(identity==i))-1]
    for (j in rows){
       new.row <- c(new.row, j)
       if(unclass(difftime(date[j+1], date[j], "days"))[1] > 366){
       insert <- c(insert,j+1)
    }</pre>
```

```
}
  }
  return(insert)
add.row <- function(df,insertion){</pre>
    df <- rbind(df[1:(insertion-1),],data.frame(id=df$id[insertion-1],</pre>
                                                  dt=df$dt[insertion-1]+years(1),a1c=NA),
                 df[insertion:nrow(df),])
  return(df)
}
p <- x
insert <- gap.check(p$id,p$dt)</pre>
lines <- insert+seq(from=0,by=1,length.out=length(insert))</pre>
for (i in 1:length(lines)){
    <- add.row(p,lines[i])
(insert <- gap.check(p$id,p$dt))</pre>
## [1] 170 180
x <- p
```

Create a new column visit. For each id, add the visit number. This should be 1 to n where n is the number of observations for an individual. This should include the observations created with missing a1c values.

```
for (i in 1:length(unique(x$id))){
  visit <- seq(1:table(x$id)[[i]])
  x$visit[x$id==i] <- visit
}</pre>
```

For each id, replace missing values with the mean a1c value for that individual.

```
for (i in 1:length(unique(x$id))){
  rows <- which(x$id==i)
  meana1c <- mean(x$a1c[rows[1]:tail(rows,n=1)],na.rm = TRUE)
  for (j in rows){
    if(is.na(x$a1c[j])){
        x$a1c[j] <- meana1c
    }
  }
}</pre>
```

Print mean a1c for each id.

## [1] 3.00000 6.75764 ## [1] 4.000000 3.892127

```
for (i in 1:length(unique(x$id))){
  rows <- which(x$id==i)
  meana1c <- mean(x$a1c[rows[1]:tail(rows,n=1)])
  print(c(as.integer(i),meana1c))
}
## [1] 1.000000 4.063372
## [1] 2.000000 7.544643</pre>
```

```
## [1] 5.000000 9.512311
## [1] 6.000000 7.555965
## [1] 7.000000 9.161686
## [1] 8.000000 7.189064
## [1] 9.000000 9.283873
## [1] 10.000000 7.975217
## [1] 11.000000 6.917562
## [1] 12.000000 7.034021
## [1] 13.000000 9.145282
## [1] 14.000000 6.623756
## [1] 15.000000 8.012406
## [1] 16.000000 4.222158
## [1] 17.000000 3.996034
## [1] 18.000000 9.164873
## [1] 19.00000 5.50721
## [1] 20.000000 3.726675
## [1] 21.000000 8.140939
## [1] 22.000000 5.637501
## [1] 23.000000
                7.366889
## [1] 24.000000
                 7.439316
## [1] 25.000000 6.877135
## [1] 26.000000 6.556759
## [1] 27.000000 4.926457
## [1] 28.000000
                 7.433917
## [1] 29.000000 4.508086
## [1] 30.000000 6.045577
## [1] 31.000000 7.116586
## [1] 32.000000 6.568791
## [1] 33.000000 6.494069
## [1] 34.000000 6.768615
## [1] 35.0000 8.4767
## [1] 36.00000 9.60441
## [1] 37.000000 9.606253
## [1] 38.000000 5.355979
## [1] 39.000000 6.917013
## [1] 40.000000 9.530136
## [1] 41.000000 9.802424
## [1] 42.00000 3.89177
## [1] 43.000000 6.095849
## [1] 44.00000 9.09167
## [1] 45.000000 6.737204
## [1] 46.000000 9.621763
## [1] 47.000000 9.231489
## [1] 48.0000 6.4046
## [1] 49.000000 6.096076
## [1] 50.000000 8.962319
```

Print total number of visits for each id.

#### table(x\$id)

Print the observations for id = 15.

```
x[which(x$id==15),]
```

```
##
                    dt
                          a1c visit
## 11
     15 2000-04-30 00:34:50 7.527105
2
3
## 1117 15 2002-04-25 06:23:05 8.012406
                                4
## 484 15 2003-06-06 14:06:00 9.133769
                                5
## 1118 15 2004-06-06 14:06:00 8.012406
                                6
## 263 15 2004-08-20 17:47:11 8.936190
                                7
```

Question 3

10 points

Import the addr.txt file from the GitHub repository. This file contains a listing of names and addresses (thanks google). Parse each line to create a data.frame with the following columns: lastname, firstname, streetno, streetname, city, state, zip. Keep middle initials or abbreviated names in the firstname column. Print out the entire data.frame.

##		lastname	firstname	streetno		streetname	city	state
##	1	Bania	Thomas M.	725		Commonwealth Ave.	Boston	MA
##	2	Barnaby	David	373		W. Geneva St.	Wms. Bay	WI
##	3	Bausch	Judy	373		W. Geneva St.	Wms. Bay	WI
##	4	Bolatto	Alberto	725		Commonwealth Ave.	Boston	MA
##	5	Carlstrom	John	933		E. 56th St.	Chicago	IL
##	6	Chamberlin	Richard A.	111		Nowelo St.	Hilo	HI
##	7	Chuss	Dave	2145		Sheridan Rd	Evanston	IL
##	8	Davis	Е. J.	933		E. 56th St.	Chicago	IL
##	9	Depoy	Darren	174		W. 18th Ave.	Columbus	OH
##	10	Griffin	Greg	5000		Forbes Ave.	Pittsburgh	PA
##	11	Halvorsen	Nils	933		E. 56th St.	Chicago	IL
##	12	Harper	Al	373		W. Geneva St.	Wms. Bay	WI
##	13	Huang	Maohai	725	W.	${\tt Commonwealth\ Ave.}$	Boston	MA
##	14	Ingalls	James G.	725	W.	${\tt Commonwealth\ Ave.}$	Boston	MA
##	15	Jackson	James M.	725	W.	${\tt Commonwealth\ Ave.}$	Boston	MA
##	16	Knudsen	Scott	373		W. Geneva St.	Wms. Bay	WI
##	17	Kovac	John	5640		S. Ellis Ave.	Chicago	IL
##	18	Landsberg	Randy	5640		S. Ellis Ave.	Chicago	IL

```
## 19
                Lo
                    Kwok-Yung
                                    1002
                                                  W. Green St.
                                                                     Urbana
                                                                                IL
## 20 Loewenstein
                    Robert F.
                                     373
                                                 W. Geneva St.
                                                                   Wms. Bay
                                                                                WI
## 21
                                                   Wilson Blvd
             Lynch
                          John
                                    4201
                                                                  Arlington
                                                                                VA
## 22
          Martini
                                     174
                                                  W. 18th Ave.
                                                                   Columbus
                                                                                OH
                          Paul
## 23
             Meyer
                       Stephan
                                     933
                                                   E. 56th St.
                                                                    Chicago
                                                                                IL
## 24
            Mrozek
                          Fred
                                     373
                                                 W. Geneva St.
                                                                   Wms. Bay
                                                                                WI
## 25
           Newcomb
                          Matt
                                    5000
                                                   Forbes Ave. Pittsburgh
                                                                                PA
## 26
                                    2145
                                                   Sheridan Rd
                                                                   Evanston
             Novak
                         Giles
                                                                                IL
## 27
            Odalen
                         Nancy
                                     373
                                                 W. Geneva St.
                                                                   Wms. Bay
                                                                                WI
## 28
                                     373
                                                 W. Geneva St.
                                                                   Wms. Bay
                                                                                WI
            Pernic
                          Dave
## 29
            Pernic
                           Bob
                                     373
                                                 W. Geneva St.
                                                                   Wms. Bay
                                                                                WI
## 30
                                    5000
                       Jeffrey
                                                   Forbes Ave. Pittsburgh
                                                                                PA
         Peterson
## 31
                                     933
             Pryke
                          Clem
                                                   E. 56th St.
                                                                    Chicago
                                                                                IL
                                                 S. Ellis Ave.
## 32
            Rebull
                                                                    Chicago
                         Luisa
                                    5640
                                                                                IL
## 33
        Renbarger
                        Thomas
                                    2145
                                                   Sheridan Rd
                                                                   Evanston
                                                                                IL
## 34
           Rottman
                           Joe
                                    8730
                                           W. Mountain View Ln
                                                                  Littleton
                                                                                CO
## 35
        Schartman
                                     933
                                                   E. 56th St.
                                                                                IL
                         Ethan
                                                                    Chicago
## 36
             Spotz
                           Bob
                                     373
                                                 W. Geneva St.
                                                                   Wms. Bay
                                                                                WI
## 37
             Thoma
                          Mark
                                     373
                                                 W. Geneva St.
                                                                   Wms. Bay
                                                                                WI
## 38
                                     933
            Walker
                         Chris
                                                 N. Cherry St.
                                                                     Tucson
                                                                                ΑZ
## 39
            Wehrer
                        Cheryl
                                    5000
                                                   Forbes Ave. Pittsburgh
                                                                                PA
## 40
             Wirth
                         Jesse
                                     373
                                                 W. Geneva St.
                                                                   Wms. Bay
                                                                                WI
## 41
                                          Holmdel-Keyport Rd.
            Wright
                                     791
                                                                    Holmdel
                                                                                NY
                          Greg
## 42
           Zingale
                       Michael
                                    5640
                                                 S. Ellis Ave.
                                                                    Chicago
                                                                                IL
##
              zip
## 1
            02215
## 2
            53191
## 3
            53191
## 4
            02215
## 5
            60637
## 6
            96720
## 7
      60208-3112
## 8
            60637
## 9
            43210
## 10
            15213
## 11
            60637
## 12
            53191
## 13
            02215
## 14
            02215
## 15
            02215
## 16
            53191
## 17
            60637
## 18
            60637
## 19
            61801
## 20
            53191
## 21
            22230
## 22
            43210
## 23
            60637
## 24
            53191
## 25
            15213
## 26
      60208-3112
## 27
            53191
## 28
            53191
## 29
            53191
```

```
## 30
            15213
## 31
           60637
## 32
           60637
## 33 60208-3112
## 34
           80125
## 35
           60637
## 36
           53191
## 37
           53191
## 38
           85721
## 39
            15213
## 40
            53191
## 41 07733-1988
## 42
           60637
```

Question 4

2 points

The first argument to most functions that fit linear models are formulas. The following example defines the response variable death and allows the model to incorporate all other variables as terms. . is used to mean all columns not otherwise in the formula.

```
url <- "https://github.com/fonnesbeck/Bios6301/raw/master/datasets/haart.csv"
haart_df <- read.csv(url)[,c('death','weight','hemoglobin','cd4baseline')]
coef(summary(glm(death ~ ., data=haart_df, family=binomial(logit))))</pre>
```

```
## Estimate Std. Error z value Pr(>|z|)
## (Intercept) 3.576411744 1.226870535 2.915069 0.0035561039
## weight -0.046210552 0.022556001 -2.048703 0.0404911395
## hemoglobin -0.350642786 0.105064078 -3.337418 0.0008456055
## cd4baseline 0.002092582 0.001811959 1.154872 0.2481427160
```

Now imagine running the above several times, but with a different response and data set each time. Here's a function:

```
myfun <- function(dat, response) {
  form <- as.formula(response ~ .)
  coef(summary(glm(form, data=dat, family=binomial(logit))))
}</pre>
```

Unfortunately, it doesn't work. tryCatch is "catching" the error so that this file can be knit to PDF.

```
tryCatch(myfun(haart_df, death), error = function(e) e)
```

```
## <simpleError in eval(expr, envir, enclos): object 'death' not found>
```

What do you think is going on? Consider using debug to trace the problem. When you use death for the response, it looks for the stored object death which is not a variable

5 bonus points

Create a working function.

```
myfun_1 <- function(dat, response) {
  form <- as.formula(paste(response, "~."))
  coef(summary(glm(form, data=dat, family=binomial(logit))))
}
myfun_1(haart_df, 'death')</pre>
```

## Estimate Std. Error z value Pr(>|z|)

```
## (Intercept) 3.576411744 1.226870535 2.915069 0.0035561039

## weight -0.046210552 0.022556001 -2.048703 0.0404911395

## hemoglobin -0.350642786 0.105064078 -3.337418 0.0008456055

## cd4baseline 0.002092582 0.001811959 1.154872 0.2481427160
```

## JC Grading +5