Programming Assignment 2

Computing for Data Analysis

Introduction

Download the file ProgAssignment2-data.zip file containing the data for Programming Assignment 2 from the Coursera web site. Unzip the file in a directory that will serve as your working directory. When you start up R make sure to change your working directory to the directory where you unzipped the data.

The data for this assignment come from the Hospital Compare web site (http://hospitalcompare.hhs.gov) run by the U.S. Department of Health and Human Services. The purpose of the web site is to provide data and information about the quality of care at over 4,000 Medicare-certified hospitals in the U.S. This dataset essentially covers all major U.S. hospitals. This dataset is used for a variety of purposes, including determining whether hospitals should be fined for not providing high quality care to patients (see http://goo.gl/jAXFX for some background on this particular topic).

The Hospital Compare web site contains a lot of data and we will only look at a small subset for this assignment. The zip file for this assignment contains three files

- outcome-of-care-measures.csv: Contains information about 30-day mortality and readmission rates for heart attacks, heart failure, and pneumonia for over 4,000 hospitals.
- hospital-data.csv: Contains information about each hospital.
- Hospital_Revised_Flatfiles.pdf: Descriptions of the variables in each file (i.e the code book).

A description of the variables in each of the files is in the included PDF file named Hospital_Revised_Flatfiles.pdf. This document contains information about many other files that are not included with this programming assignment. You will want to focus on the variables for Number 19 ("Outcome of Care Measures.csv") and Number 11 ("Hospital_Data.csv"). You may find it useful to print out this document (at least the pages for Tables 19 and 11) to have next to you while you work on this assignment. In particular, the numbers of the variables for each table indicate column indices in each table (i.e. "Hospital Name" is column 2 in the outcome-of-care-measures.csv file).

1 Plot the 30-day mortality rates for heart attack

Read the outcome data into R via the read.csv function and look at the first few rows.

```
> outcome <- read.csv("outcome-of-care-measures.csv", colClasses = "character")
> head(outcome)
```

There are many columns in this dataset. You can see how many by typing ncol(outcome) (you can see the number of rows with the nrow function). In addition, you can see the names of each column by typing names(outcome) (the names are also in the PDF document.

To make a simple histogram of the 30-day death rates from heart attack (column 11 in the outcome dataset), run

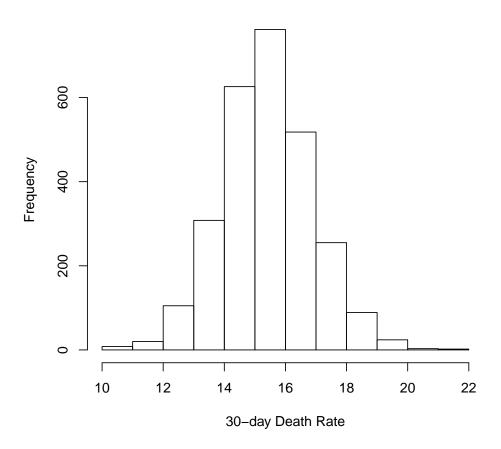
```
> outcome[, 11] <- as.numeric(outcome[, 11])
> ## You may get a warning about NAs being introduced; that is okay
> hist(outcome[, 11])
```

Because we originally read the data in as character (by specifying colClasses = "character" we need to coerce the column to be numeric. You may get a warning about NAs being introduced but that is okay. This code creates a histogram of the death rates but could benefit from some better labelling.

- 1. Add a label to the x-axis that says "30-day Death Rate"
- 2. Add a title for the histogram that says "Heart Attack 30-day Death Rate"

Your final figure should look like the figure below.

Heart Attack 30-day Death Rate



There is nothing to submit for this part of the assignment.

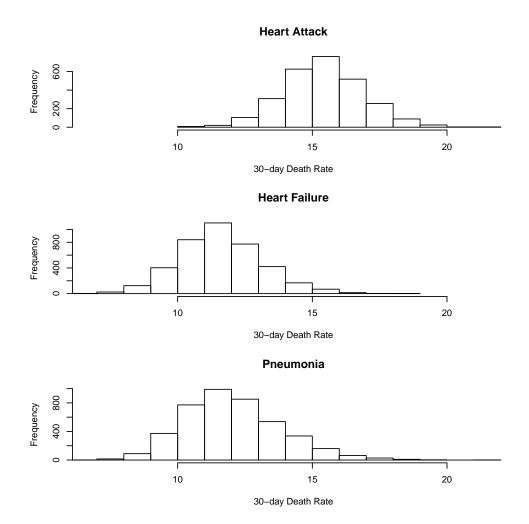
2 Plot the 30-day mortality rates for heart attack, heart failure, and pneumonia

If you haven't already, read in the outcome-of-care-measures.csv dataset using the code specified above.

- 1. Identify which columns of the data frame contain the 30-day death rate from heart attack, heart failure, and pneumonia.
- 2. Coerce these columns to be numeric using the as.numeric function as above. You may receive warnings about NAs but that is okay.

- 3. Make histograms of the death rates for each outcome and put the histograms on the same plot window. This can be done by running par(mfrow = c(3, 1)) before calling hist. This sets the plot window to have 3 rows and 1 column.
- 4. For each plot (there should be three plots, one for each outcome) make sure the x-axis label is "30-day Death Rate".
- 5. For each plot, set the title of the plot to be the outcome (i.e. heart attack, heart failure, or pneumonia).
- 6. Each time you call hist, a new plot is constructed using the data to be plotted. However, this makes it difficult to compare histograms across outcomes. Set all of the histograms to have the same numerical range on the x-axis by using the xlim argument. You can calculate the range of a vector of numbers by using the range function.

Your final figure should like the figure below.



Try the following variations on this plot:

- 1. Instead of plotting the histograms on top of each other, plot them all in a row, side by side.
- 2. Using the median and the abline function, draw a vertical line on each histogram at the location of the median for that outcome.
- 3. In the title of each histogram, put in parentheses the mean death rate by adding $(\bar{X} = ??)$ where ?? is the actual mean for that outcome. Consult the help page for plotmath to see how to get the \bar{X} to appear on the plot.

4. Add a smooth density estimate on top of the histogram. To do this you need to use the density function and you need to set prob=TRUE when calling hist.

There is nothing to submit for this part of the assignment.

3 Plot 30-day death rates by state

The outcome-of-care-measures.csv file contains information about what state each hospital is located in (in the State variable). The goal of this part is to plot the hospital 30-day death rates by state.

If you have not done so yet, read in the outcome data to R and coerce the 30-day death rate for heart attack to be numeric.

```
> outcome <- read.csv("outcome-of-care-measures.csv", colClasses = "character")
> outcome[, 11] <- as.numeric(outcome[, 11])</pre>
```

First, check to see how many hospitals are included in the dataset by state. We want to remove some states where there are very few hospitals. You can use the table function to count the number of observations in each state.

> table(outcome\$State)

```
CA
    AT.
        AR.
             AZ
                      CO
                          CT
                              DC
                                   DE FL
                                            GA
                                                GU
                                                     HI
                                                         ΙA
                                                              ID
                                                                  IL
                                                                      IN
                                                                           KS
17
    98
        77
             77 341
                      72
                          32
                                8
                                    6 180 132
                                                 1
                                                     19 109
                                                              30 179 124 118
                                                                               96 114
            ΜI
                 MN
                      MO
                          MS
                              MT
                                   NC
                                       ND
                                            NE
                                                NH
                                                     N.J
                                                         NM
                                                                      OH
                                                                           ΩK
                                                         40
                                                              28 185 170 126
68
    45
        37 134 133 108
                          83
                              54 112
                                       36
                                            90
                                                26
                                                     65
                                                                               59 175
    RΙ
        SC
             SD
                 TN
                          UT
                              VA
                                       VT
                                                     WV
                                                         WY
PR
                      ΤX
                                   VI
                                            WA
                                                WI
                                            88 125
             48 116 370
                          42
                              87
                                    2
                                       15
                                                     54
                                                         29
```

Subset the original dataset and exclude states that contain less than 20 hospitals. Name this new subsetted dataset outcome 2.

A basic boxplot of the death rates by state can be made running the following code.

```
> death <- outcome2[, 11]
> state <- outcome2$State
> boxplot(death ~ state)
```

Add the following aspects to the plot

- 1. Set the y-axis label to say "30-day Death Rate"
- 2. Set the title of the plot to be "Heart Attack 30-day Death Rate by State"
- 3. Set the x- and y-axis tick labels to be perpendicular to the axis so that the abbreviated names of all the states will appear on the plot. Use the par function to set this.
- 4. **Challenge**: Sort the states by their median 30-day death rate and plot the boxplots in order of their median rate. Note that the boxplot function also accepts a list as its first argument in addition to a formula.

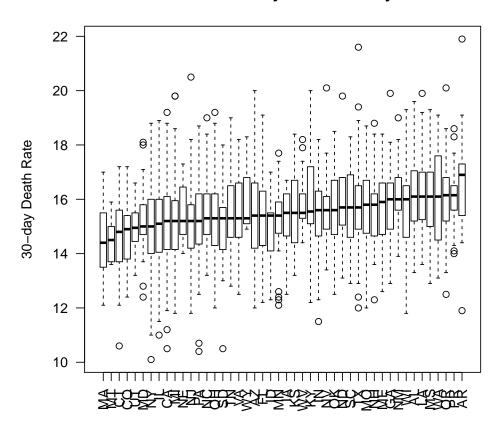
The final figure is shown on the next page.

You may also want to try

- 1. Shrink the x-axis tick labels so that the abbreviated state names do not overlap each other
- 2. Challenge: Alter the x-axis tick labels so that they include the number of hospitals in that state in parentheses. For example, the label for the state of Connecticut would be CT (32). You will need the axis function and when you call the boxplot function you will want to set the option xaxt to be "n".

There is nothing to submit for this part of the assignment.

Heart Attack 30-day Death Rate by State



4 Plot 30-day death rates and numbers of patients

The lattice package can be used to plot relationships while conditioning on various factor variables. The goal of this part is the plot the relationship between the number of patients a hospital sees for a certain outcome and the 30-day death rate for that outcome. The hypothesis is that the more patients a hospital sees, the better the outcome for the patients. We are going to examine this relationship by the hospital ownership type.

First we need to read in the outcome data and the hospital data.

```
> outcome <- read.csv("outcome-of-care-measures.csv", colClasses = "character")
> hospital <- read.csv("hospital-data.csv", colClasses = "character")</pre>
```

Then we are going to want to merge the two datasets together to match the Hospital.Ownership variable to the death rate data.

```
> outcome.hospital <- merge(outcome, hospital, by = "Provider.Number")
```

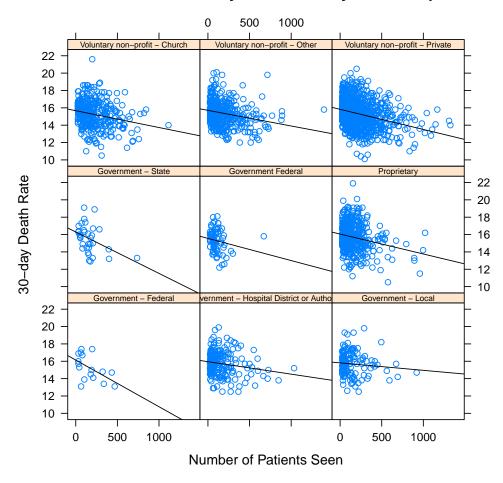
From here, we can create the relevant variables that we want to plot.

- > death <- as.numeric(outcome.hospital[, 11]) ## Heart attack outcome
- > npatient <- as.numeric(outcome.hospital[, 15])</pre>
- > owner <- factor(outcome.hospital\$Hospital.Ownership)</pre>

- 1. Use the xyplot function in the lattice package to make a plot of the relationship between 30-day death rate for heart attack versus the number of patients seen. The number of patients should be on the x-axis. Make sure you run library(lattice) before calling xyplot.
- 2. Set the x-axis label to be "Number of Patients Seen"
- 3. Set the y-axis label to be "30-day Death Rate"
- 4. Set the title of the plot to be "Heart Attack 30-day Death Rate by Ownership"
- 5. In each panel of the plot, add a linear regression line highlighting the relationship between number of patients seen and the death rate. Use the panel.lmline function for this.

The final plot is below.

Heart Attack 30-day Death Rate by Ownership



There is nothing to submit for this part of the assignment.

5 Finding the best hospital in a state

Write a function called best that take two arguments: the 2-character abbreviated name of a state and an outcome name. The function reads the outcome-of-care-measures.csv file and returns a character vector with the name of the hospital that has the best (i.e. lowest) 30-day mortality for the specified outcome in that state. The hospital name is the name provided in the Hospital.Name variable. The outcomes can be one of "heart attack", "heart failure", or "pneumonia". Hospitals that do not have data on a particular outcome should be excluded from the set of hospitals when deciding the rankings.

Handling ties. If there is a tie for the best hospital for a given outcome, then the hospital names should be sorted in alphabetical order and the first hospital in that set should be chosen (i.e. if hospitals "b", "c", and "f" are tied for best, then hospital "b" should be returned).

The function should use the following template.

```
best <- function(state, outcome) {
    ## Read outcome data

    ## Check that state and outcome are valid

    ## Return hospital name in that state with lowest 30-day death
    ## rate
}</pre>
```

The function should check the validity of its arguments. If an invalid state value is passed to best, the function should throw an error via the stop function with the exact message "invalid state". If an invalid outcome value is passed to best, the function should throw an error via the stop function with the exact message "invalid outcome".

Here is some sample output from the function.

```
> source("best.R")
> best("TX", "heart attack")

[1] "CYPRESS FAIRBANKS MEDICAL CENTER"
> best("TX", "heart failure")

[1] "FORT DUNCAN MEDICAL CENTER"
> best("MD", "heart attack")

[1] "JOHNS HOPKINS HOSPITAL, THE"
> best("MD", "pneumonia")

[1] "GREATER BALTIMORE MEDICAL CENTER"
> best("BB", "heart attack")
Error in best("BB", "heart attack") : invalid state
> best("NY", "hert attack")
Error in best("NY", "hert attack") : invalid outcome
```

Save your code for this function to a file named best.R.

Use the submit script provided to submit your solution to this part. There are 3 tests that need to be passed for this part of the assignment.

6 Ranking hospitals by outcome in a state

Write a function called rankhospital that takes three arguments: the 2-character abbreviated name of a state (state), an outcome (outcome), and the ranking of a hospital in that state for that outcome (num). The function reads the outcome-of-care-measures.csv file and returns a character vector with the name of the hospital that has the ranking specified by the num argument. For example, the call

```
rankhospital("MD", "heart failure", 5)
```

would return a character vector containing the name of the hospital with the 5th lowest 30-day death rate for heart failure. The num argument can take values "best", "worst", or an integer indicating the ranking (smaller numbers are better). If the number given by num is larger than the number of hospitals in that state, then the function should return NA. Hospitals that do not have data on a particular outcome should be excluded from the set of hospitals when deciding the rankings.

Handling ties. It may occur that multiple hospitals have the same 30-day mortality rate for a given cause of death. In those cases ties should be broken by using the hospital name. For example, in Texas ("TX"), the hospitals with lowest 30-day mortality rate for heart failure are shown here.

> head(texas)

```
Hospital.Name Rate Rank
3935
           FORT DUNCAN MEDICAL CENTER
4085
     TOMBALL REGIONAL MEDICAL CENTER
4103 CYPRESS FAIRBANKS MEDICAL CENTER
3954
               DETAR HOSPITAL NAVARRO
                                               4
                                        8.7
4010
               METHODIST HOSPITAL, THE
                                       8.8
                                               5
      MISSION REGIONAL MEDICAL CENTER
3962
                                       8.8
```

Note that Cypress Fairbanks Medical Center and Detar Hospital Navarro both have the same 30-day rate (8.7). However, because Cypress comes before Detar alphabetically, Cypress is ranked number 3 in this scheme and Detar is ranked number 4. One can use the order function to sort multiple vectors in this manner (i.e. where one vector is used to break ties in another vector).

The function should use the following template.

```
rankhospital <- function(state, outcome, num = "best") {
    ## Read outcome data

## Check that state and outcome are valid

## Return hospital name in that state with the given rank
    ## 30-day death rate
}</pre>
```

The function should check the validity of its arguments. If an invalid state value is passed to best, the function should throw an error via the stop function with the exact message "invalid state". If an invalid outcome value is passed to best, the function should throw an error via the stop function with the exact message "invalid outcome".

Here is some sample output from the function.

```
> source("rankhospital.R")
> rankhospital("TX", "heart failure", 4)
[1] "DETAR HOSPITAL NAVARRO"
> rankhospital("MD", "heart attack", "worst")
```

```
[1] "HARFORD MEMORIAL HOSPITAL"
> rankhospital("MN", "heart attack", 5000)
[1] NA
```

Save your code for this function to a file named rankhospital.R.

Use the submit script provided to submit your solution to this part. There are 4 tests that need to be passed for this part of the assignment.

7 Ranking hospitals in all states

Write a function called rankall that takes two arguments: an outcome name (outcome) and a hospital ranking (num). The function reads the outcome-of-care-measures.csv file and returns a 2-column data frame containing the hospital in each state that has the ranking specified in num. For example the function call rankall("heart attack", "best") would return a data frame containing the names of the hospitals that are the best in their respective states for 30-day heart attack death rates. The function should return a value for every state (some may be NA). The first column in the data frame is named hospital, which contains the hospital name, and the second column is named state, which contains the 2-character abbreviation for the state name. Hospitals that do not have data on a particular outcome should be excluded from the set of hospitals when deciding the rankings.

Handling ties. The rankall function should handle ties in the 30-day mortality rates in the same way that the rankhospital function handles ties.

The function should use the following template.

```
rankall <- function(outcome, num = "best") {
    ## Read outcome data

## Check that state and outcome are valid

## For each state, find the hospital of the given rank

## Return a data frame with the hospital names and the

## (abbreviated) state name
}</pre>
```

NOTE: For the purpose of this part of the assignment (and for efficiency), your function should NOT call the rankhospital function from the previous section.

The function should check the validity of its arguments. If an invalid outcome value is passed to rankall, the function should throw an error via the stop function with the exact message "invalid outcome". The num variable can take values "best", "worst", or an integer indicating the ranking (smaller numbers are better). If the number given by num is larger than the number of hospitals in that state, then the function should return NA.

Here is some sample output from the function.

```
AL
        D W MCMILLAN MEMORIAL HOSPITAL
                                           AL
AR.
     ARKANSAS METHODIST MEDICAL CENTER
                                           AR
  JOHN C LINCOLN DEER VALLEY HOSPITAL
ΑZ
                                           ΑZ
                 SHERMAN OAKS HOSPITAL
CA
                                           CA
CO
              SKY RIDGE MEDICAL CENTER
                                           CO
               MIDSTATE MEDICAL CENTER
CT
                                           CT
DC
                                   <NA>
                                           DC
DE
                                   <NA>
                                           DE
FL
        SOUTH FLORIDA BAPTIST HOSPITAL
                                           FL
> tail(rankall("pneumonia", "worst"), 3)
                                      hospital state
WI MAYO CLINIC HEALTH SYSTEM - NORTHLAND, INC
WV
                        PLATEAU MEDICAL CENTER
                                                   WV
             NORTH BIG HORN HOSPITAL DISTRICT
WY
> tail(rankall("heart failure"), 10)
                                                              hospital state
TN
                            WELLMONT HAWKINS COUNTY MEMORIAL HOSPITAL
                                                                           TN
TX
                                           FORT DUNCAN MEDICAL CENTER
                                                                           TX
UT VA SALT LAKE CITY HEALTHCARE - GEORGE E. WAHLEN VA MEDICAL CENTER
                                                                           UT
VA
                                              SENTARA POTOMAC HOSPITAL
                                                                           VA
                               GOV JUAN F LUIS HOSPITAL & MEDICAL CTR
VI
                                                                           VI
```

Save your code for this function to a file named rankall.R.

VT

WA

WI

WV

WY

Use the submit script provided to submit your solution to this part. There are 3 tests that need to be passed for this part of the assignment.

SPRINGFIELD HOSPITAL

HARBORVIEW MEDICAL CENTER

FAIRMONT GENERAL HOSPITAL

CHEYENNE VA MEDICAL CENTER

AURORA ST LUKES MEDICAL CENTER

VT

WA

WI

WV

WY