Lab 8

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Using your own dataset (which may include more than one table) carry out the following data cleaning steps. Knit together the PDF document and commit both the Lab 8 RMD file and the PDF document to Git. Push the changes to GitHub so both documents are visible in your public GitHub repository.

Before you begin: as many of you have large datasets, you're going to want to select only the variables you're interested in utilizing for this project (ideally no more than twenty columns but perhaps much smaller) so you don't have R Studio's memory working on the entire dataset. The example code provided below can be modified to allow you to subset your data to only the variables you wish to use. First, read in your complete dataset and save it as data. Then, add the names of the variables you wish to use for your poster project to the select function, separated by commas. Run the two lines of code to save this new, smaller version of your data to data_subset. Use this smaller dataset to complete the rest of the lab

```
# Adding dplyr to the library for select function
library(dplyr)
## Warning: package 'dplyr' was built under R version 3.3.2
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
       intersect, setdiff, setequal, union
##
# loading the csv file.
data_95_96 <- read.csv("clean_data/initial_data/95-96.csv")</pre>
# add year to the data in case I want to merge later
data 95 96$YEAR <- 1996
# Selecting the variables that I'm using
data_subset_95_96 <- data_95_96 %>%
  select (MONRACE, YEAR, MONSEX, EDUCATN, AGE, STATMIN, STATMAX, DISPOSIT, TOTPRISN, XFOLSOR, XCRHISSR,
```

1. To get a feel for its structure, look at the class, dimensions, column names, structure, and basic summary statistics of your data.

I will test the 1995-1996 data, and uniformize the variables to factors as needed

```
class(data_subset_95_96)

## [1] "data.frame"

dim(data_subset_95_96)

## [1] 42436 13
```

```
colnames(data_subset_95_96)
                               "MONSEX"
    [1] "MONRACE"
                   "YEAR"
                                          "EDUCATN"
                                                     "AGE"
   [7] "STATMAX"
                   "DISPOSIT" "TOTPRISN" "XFOLSOR"
                                                     "XCRHISSR" "DISTRICT"
## [13] "MONCIRC"
str(data_subset_95_96)
                    42436 obs. of 13 variables:
  'data.frame':
   $ MONRACE: Factor w/ 6 levels "American Indian or Alaskan Native",..: 3 3 3 6 6 6 6 6 6 6 ...
              : num 1996 1996 1996 1996 ...
   $ YEAR
   $ MONSEX : Factor w/ 3 levels "Female","Male",..: 1 2 2 2 2 1 1 2 2 2 ...
   $ EDUCATN : Factor w/ 29 levels "Associate degree (AA)",...: 24 13 23 4 24 13 4 7 7 13 ...
              : Factor w/ 69 levels "16","17","18",...: 5 39 6 10 20 6 32 6 30 8 ...
   $ STATMIN : Factor w/ 28 levels "0","1","12","120",...: 4 1 1 18 1 1 1 1 1 18 ...
   \$ STATMAX : Factor w/ 124 levels "100", "105", "108",...: 69 31 30 61 45 76 30 76 76 61 ...
   $ DISPOSIT: Factor w/ 6 levels "Both guilty plea and trial",..: 2 2 2 2 2 2 2 2 2 2 ...
   $ TOTPRISN: Factor w/ 358 levels "1","10","100",...: 24 53 333 214 135 242 1 268 53 324 ...
## $ XFOLSOR : Factor w/ 57 levels "1","10","11",...: 16 4 20 16 7 7 5 53 2 16 ...
  $ XCRHISSR: Factor w/ 8 levels "1","2","3","4",..: 3 4 3 3 1 5 1 1 3 4 ...
   $ DISTRICT: int 23 45 25 4 70 70 70 41 46 42 ...
   $ MONCIRC : int 4 6 4 1 9 9 9 5 6 5 ...
summary(data_subset_95_96)
##
                                 MONRACE
                                                    YEAR
##
   American Indian or Alaskan Native: 681
                                               Min.
                                                      :1996
   Asian or Pacific Islander
                                      : 1265
                                               1st Qu.:1996
## Black
                                      :12562
                                               Median:1996
## Missing or Indeterminable
                                      : 2027
                                               Mean
                                                     :1996
   Other
                                               3rd Qu.:1996
##
                                          57
##
   White/Caucasian
                                      :25844
                                               Max.
                                                      :1996
##
##
                          MONSEX
                                                                   EDUCATN
##
   Female
                             : 6540
                                       High school graduate
                                                                       : 7728
                              :35893
##
   Male
                                       Some college
                                                                       : 6451
                                       GED (General Education Diploma): 3873
   Missing or Indeterminable:
##
                                       Nine yr school completed
                                                                       : 2761
##
                                       Ten yr school completed
                                                                       : 2671
##
                                       Eleven yr school compl
                                                                       : 2624
##
                                       (Other)
                                                                       :16328
         AGE
                                          STATMIN
##
##
    25
           : 1724
                    0
                                              :29394
           : 1713
                                              : 5871
##
   24
                    120
##
   26
           : 1694
                    60
                                              : 5615
##
   27
           : 1687
                    180
                                                 570
##
   23
           : 1625
                    240
                                                 359
##
   31
           : 1592
                    Missing or Indeterminable:
                                                 195
##
    (Other):32401
                    (Other)
                                                 432
##
                 STATMAX
                                                        DISPOSIT
##
   60
                     : 7454
                              Both guilty plea and trial
  Life imprisonment: 7091
                              Guilty plea
                                                            :38842
##
   240
                     : 5083
                              Jury trial
                                                            : 3522
##
   120
                     : 5024
                              Missing or Indeterminable
                                                                 6
```

27

Nolo contendere

##

480

: 4603

```
##
                       : 2262
                                 Trial by judge or bench trial:
##
    (Other)
                       :10919
##
                                 TOTPRISN
                                                                      XFOLSOR
##
    No prison or - 1 month ordered: 8839
                                                                           : 3097
##
                                      : 2263
                                               Missing or Indeterminable: 2829
##
    12
                                     : 1703
                                                                           : 2509
    60
                                     : 1424
                                               13
                                                                           : 2024
##
    18
                                      : 1421
                                               23
                                                                           : 1926
##
    30
                                      : 1352
                                               4
                                                                           : 1633
##
    (Other)
                                      :25434
                                                (Other)
                                                                           :28418
##
       XCRHISSR
                         DISTRICT
                                           MONCIRC
##
    1
            :22205
                             : 0.00
                                       Min.
                                               : 0.000
##
    3
            : 5006
                      1st Qu.:22.00
                                       1st Qu.: 4.000
    2
            : 4283
##
                      Median :41.00
                                       Median : 6.000
##
    6
            : 3599
                             :43.68
                                               : 6.445
                      Mean
                                       Mean
##
    9
            : 2795
                      3rd Qu.:70.00
                                        3rd Qu.: 9.000
##
    4
            : 2695
                      Max.
                              :96.00
                                       Max.
                                               :11.000
    (Other): 1853
```

2. Preview the first and last 15 rows of your data. Is you dataset tidy? If not, what principles of tidy data does it seem to be violating?

```
# Calling head and tail, the data appears to be tidy
head(data_subset_95_96, 15)
```

```
##
                         MONRACE YEAR MONSEX
                                                                        EDUCATN
## 1
                           Black 1996 Female
                                                       Ten yr school completed
## 2
                           Black 1996
                                         Male
                                                      Nine yr school completed
## 3
                           Black 1996
                                         Male Some trade or vocational school
## 4
                 White/Caucasian 1996
                                         Male
                                                        Eleven yr school compl
                 White/Caucasian 1996
## 5
                                         Male
                                                       Ten yr school completed
## 6
                 White/Caucasian 1996 Female
                                                     Nine yr school completed
                 White/Caucasian 1996 Female
## 7
                                                        Eleven yr school compl
                 White/Caucasian 1996
                                         Male GED (General Education Diploma)
                 White/Caucasian 1996
## 9
                                         Male GED (General Education Diploma)
## 10
                 White/Caucasian 1996
                                         Male
                                                      Nine yr school completed
## 11
                 White/Caucasian 1996
                                         Male
                                                          High school graduate
## 12
                           Black 1996 Female
                                                        Eleven yr school compl
## 13
                 White/Caucasian 1996
                                         Male
                                                          High school graduate
## 14 Missing or Indeterminable 1996
                                                        Eleven yr school compl
                                         Male
## 15
                 White/Caucasian 1996
                                                        Eleven yr school compl
##
      AGE STATMIN STATMAX
                              DISPOSIT
                                                               TOTPRISN
## 1
       20
              120
                       540 Guilty plea
                                                                     120
##
  2
       54
                 0
                       252 Guilty plea
                                                                      15
## 3
       21
                0
                                                                      87
                       240 Guilty plea
## 4
       25
               60
                       480 Guilty plea
                                                                      36
## 5
       35
                0
                        36 Guilty plea
                                                                      24
## 6
       21
                0
                        60 Guilty plea
                                                                      42
## 7
       47
                0
                       240 Guilty plea
                                                                       1
## 8
       21
                0
                        60 Guilty plea
                                                                       5
## 9
                0
                                                                      15
       45
                        60 Guilty plea
## 10
       23
                60
                                                                      80
                       480 Guilty plea
## 11
       22
                0
                       120 Guilty plea
                                                                       5
## 12
       32
                0
                        12 Guilty plea No prison or - 1 month ordered
## 13
       32
                0
                       480 Guilty plea
                                                                     151
```

```
## 14
                  0
                          12 Guilty plea No prison or - 1 month ordered
## 15
       29
                  0
                        120 Guilty plea No prison or - 1 month ordered
##
                           XFOLSOR XCRHISSR DISTRICT MONCIRC
## 1
                                 23
                                            3
                                                     23
##
  2
                                 12
                                            4
                                                     45
                                                               6
## 3
                                 27
                                            3
                                                     25
                                                               4
## 4
                                23
                                            3
                                                               1
## 5
                                15
                                            1
                                                     70
                                                               9
## 6
                                15
                                            5
                                                     70
                                                               9
## 7
                                                     70
                                                               9
                                 13
                                            1
## 8
                                  9
                                            1
                                                     41
                                                               5
## 9
                                 10
                                            3
                                                     46
                                                               6
## 10
                                 23
                                            4
                                                     42
                                                               5
                                                     35
                                                               5
## 11
                                  9
                                            1
                                            9
                                                      8
                                                               2
## 12 Missing or Indeterminable
                                                               2
                                            3
                                                      8
                                            9
                                                      8
                                                               2
## 14 Missing or Indeterminable
                                                               2
                                            1
                                                      8
```

tail(data_subset_95_96, 15)

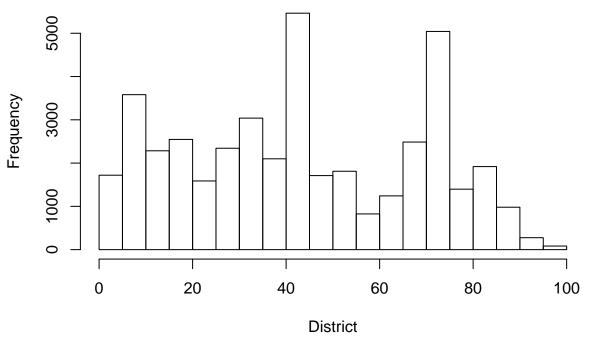
```
MONRACE YEAR MONSEX
##
## 42422
                                       Black 1996
## 42423
                            White/Caucasian 1996 Female
## 42424 American Indian or Alaskan Native 1996
                                                    Male
## 42425
                                       Black 1996
                                                    Male
## 42426
                                       Black 1996
                                                    Male
                            White/Caucasian 1996
## 42427
                                                    Male
## 42428
                            White/Caucasian 1996
                                                    Male
## 42429
                            White/Caucasian 1996
                                                    Male
## 42430
                            White/Caucasian 1996
                                                    Male
## 42431
                            White/Caucasian 1996
                                                    Male
                 Missing or Indeterminable 1996
## 42432
                                                    Male
## 42433
                                       Black 1996
                                                    Male
## 42434
                 Asian or Pacific Islander 1996
                                                    Male
## 42435
                            White/Caucasian 1996
                                                    Male
## 42436
                            White/Caucasian 1996
                                                    Male
##
                                  EDUCATN AGE STATMIN STATMAX
                                                                   DISPOSIT
                                                            480 Guilty plea
## 42422
                     High school graduate
                                                    60
## 42423
                    Associate degree (AA)
                                                     0
                                                             12 Guilty plea
## 42424
                                                     0
                  Eleven yr school compl
                                            29
                                                             12 Guilty plea
## 42425
                  Eleven yr school compl
                                            22
                                                     0
                                                            240 Guilty plea
                                                            240 Guilty plea
## 42426
         GED (General Education Diploma)
                                            22
                                                     0
## 42427
                                                     0
                                                             24 Guilty plea
                Nine yr school completed
                                            25
## 42428
                    Eight yr school compl
                                                     0
                                                             24 Guilty plea
                                            25
## 42429
               Missing or Indeterminable
                                            28
                                                     0
                                                             24 Guilty plea
               Missing or Indeterminable
## 42430
                                            26
                                                     0
                                                             24 Guilty plea
## 42431
                    Associate degree (AA)
                                            19
                                                     0
                                                             12 Guilty plea
## 42432
               Missing or Indeterminable
                                            32
                                                     0
                                                             24 Guilty plea
                                                            240 Guilty plea
## 42433
                             Some college
                                            35
                                                     0
## 42434
                     High school graduate
                                            35
                                                     0
                                                             60 Guilty plea
## 42435
                                                     0
                             Some college
                                                            240 Guilty plea
                                            34
## 42436
                     High school graduate
                                            34
                                                     0
                                                             60 Guilty plea
##
                                                             XFOLSOR XCRHISSR
                                TOTPRISN
## 42422
              Missing or Indeterminable Missing or Indeterminable
```

```
## 42423 No prison or - 1 month ordered
## 42424 No prison or - 1 month ordered Missing or Indeterminable
                                                                            9
## 42425
                                                                            5
## 42426
              Missing or Indeterminable Missing or Indeterminable
                                                                            9
## 42427
                                      24 Missing or Indeterminable
                                                                            9
## 42428
                                      24 Missing or Indeterminable
                                                                            9
## 42429
                                      24 Missing or Indeterminable
                                                                            9
## 42430
                                      24 Missing or Indeterminable
                                                                            9
## 42431 No prison or - 1 month ordered Missing or Indeterminable
                                                                            9
## 42432
                                                                            6
                                      24
## 42433
                                     151 Missing or Indeterminable
                                                                            9
## 42434 No prison or - 1 month ordered Missing or Indeterminable
                                                                            9
## 42435
                                      28
                                                                            1
## 42436 No prison or - 1 month ordered Missing or Indeterminable
                                                                            9
         DISTRICT MONCIRC
## 42422
               47
## 42423
               78
                         9
## 42424
               88
                        10
## 42425
               78
                        9
## 42426
               39
                         5
## 42427
               79
                         9
## 42428
               79
                         9
## 42429
               79
                         9
## 42430
               79
## 42431
               10
                         2
## 42432
               74
## 42433
               73
                         9
## 42434
               73
                         9
## 42435
               73
                         9
## 42436
               73
```

3. Create a histogram for at least two variables you plan to focus on for your study. Describe what these plots show you about these variables.

```
# Calling histogram for number of sentences per district for the data from 1995-1996.
hist(data_subset_95_96$DISTRICT, main = "District Sentenced", xlab = "District")
```

District Sentenced



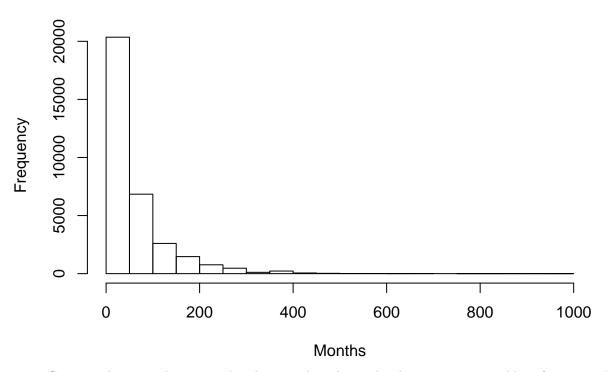
Calling historgram for number for the length of the sentence. Note that because the letters are # currently factors (e.g. less than 1 day of imprisonment), I will be switching them from factors # to numeric, and excluding these observations (hence the "NAs introduced by coercion warning).

data_subset_95_96\$TOTPRISN <- as.numeric(paste(data_subset_95_96\$TOTPRISN))</pre>

Warning: NAs introduced by coercion

hist(data_subset_95_96\$TOTPRISN, main = "Total Prison Sentenced", xlab = "Months")

Total Prison Sentenced

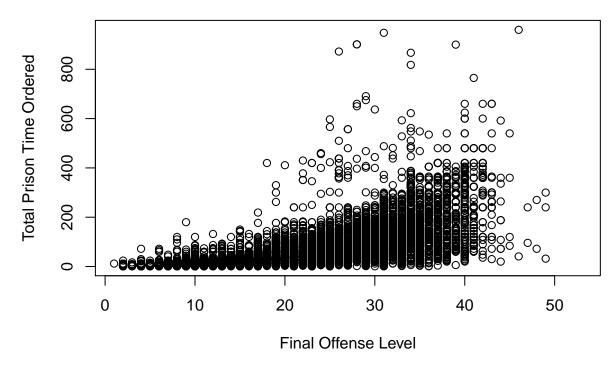


4. Create at least one bivariate plot showing the relationship between two variables of interest. What does/do the(se) plot(s) tell you about the association between these two variables?

library(ggplot2)

```
## Warning: package 'ggplot2' was built under R version 3.3.2
data_subset_95_96$XFOLSOR <- as.numeric(paste(data_subset_95_96$XFOLSOR))

## Warning: NAs introduced by coercion
plot(y = data_subset_95_96$TOTPRISN, x = data_subset_95_96$XFOLSOR, xlab = "Final Offense Level", ylab</pre>
```



5. Load the tidyr package. Do all of your columns correspond to variables? Do any columns represent multiple variables? If your answer is yes to either question, carry out the appropriate tidyr function (gather() or spread() respectively) to tidy your data. # Not applicable.

My data columns appear to be fine.

```
install.packages("tidyr", repos = "http://cran.us.r-project.org")

## Installing package into '/Users/hsujohnathan/Library/R/3.3/library'

## (as 'lib' is unspecified)

##

## The downloaded binary packages are in

## /var/folders/_v/bp2t8nmd09xb117j2mqg88140000gn/T//RtmpeUdsda/downloaded_packages

library(tidyr)
```

- ## Warning: package 'tidyr' was built under R version 3.3.2
 - 6. Do any columns need to be separated into two or more? Do any columns need to be combined into one? If so, carry out the appropriate the appropriate tidyr function (separate() or unite() respectively) to tidy your data.

Not applicable.

At this stage each row in your data should represent one observation, each column should be a variable, and each table should be observational unit.

7. What is the class of each of the variables in your analysis? Are these classes appropriate for the type of measurement they purport to capture? Explain your reasoning.

This is an issue with my dataset. Currently, a lot of these variables are in factors (because there are special cases). I will be introducing NAs through coersion.

8. Do any of your variables need to be coerced into a different data type? If so, carry out the appropriate coercion methods below. (This includes transformation of any date objects using the lubridate package)

Nope.

9. Are there any strings you need to manipulate for your analysis? If so, use the appropriate function from the stringr package.

Nope.

10. Do you have any missing values in your dataset? How many and how are they coded? Be sure to look out for specific codebook values for missing values (i.e. -1 for NA) as well as empty strings or other software-specific values for NA. Don't worry about removing NAs yet - we'll tackle this question later once discern whether they're random or systematically distributed.

These are different every year. There are a bunch of NAs in the dataset though.

summary(data_subset_95_96)

```
##
                                    MONRACE
                                                       YEAR
    American Indian or Alaskan Native:
##
                                           681
                                                          :1996
                                                  Min.
    Asian or Pacific Islander
                                        : 1265
                                                  1st Qu.:1996
##
    Black
                                        :12562
                                                  Median:1996
    Missing or Indeterminable
                                        : 2027
##
                                                  Mean
                                                          :1996
##
    Other
                                            57
                                                  3rd Qu.:1996
##
    White/Caucasian
                                        :25844
                                                  Max.
                                                          :1996
##
##
                            MONSEX
                                                                       EDUCATN
##
    Female
                                         High school graduate
                                : 6540
                                                                           : 7728
##
                                :35893
                                         Some college
                                                                           : 6451
                                         GED (General Education Diploma): 3873
##
    Missing or Indeterminable:
                                     3
##
                                         Nine yr school completed
                                                                           : 2761
##
                                         Ten yr school completed
                                                                           : 2671
##
                                         Eleven yr school compl
                                                                           : 2624
##
                                         (Other)
                                                                           :16328
##
         AGE
                                            STATMIN
##
    25
            : 1724
                     0
                                                 :29394
            : 1713
                                                 : 5871
##
    24
                     120
##
    26
             1694
                     60
                                                 : 5615
##
    27
             1687
                     180
                                                    570
    23
                                                    359
##
            : 1625
                     240
##
    31
            : 1592
                                                    195
                     Missing or Indeterminable:
    (Other):32401
##
                      (Other)
                                                    432
##
                  STATMAX
                                                            DISPOSIT
                                Both guilty plea and trial
##
    60
                       : 7454
                                                                     32
                                Guilty plea
    Life imprisonment: 7091
##
                                                                :38842
                                Jury trial
##
    240
                       : 5083
                                                                : 3522
##
    120
                                Missing or Indeterminable
                       : 5024
                                                                     6
##
    480
                       : 4603
                                Nolo contendere
                                                                     27
                                                                     7
##
    12
                       : 2262
                                Trial by judge or bench trial:
##
    (Other)
                       :10919
##
       TOTPRISN
                          XFOLSOR
                                           XCRHISSR
                                                             DISTRICT
##
                                                :22205
                                                                 : 0.00
    Min.
            : 1.00
                      Min.
                              : 1.00
                                        1
                                                          Min.
##
    1st Qu.: 15.00
                       1st Qu.:10.00
                                        3
                                                : 5006
                                                          1st Qu.:22.00
##
    Median: 34.00
                       Median :18.00
                                        2
                                                : 4283
                                                          Median :41.00
##
    Mean
            : 59.29
                              :18.44
                                        6
                                                : 3599
                                                          Mean
                                                                 :43.68
                       Mean
##
    3rd Qu.: 72.00
                       3rd Qu.:25.00
                                                : 2795
                                        9
                                                          3rd Qu.:70.00
            :960.00
                              :53.00
                                                : 2695
##
    Max.
                       Max.
                                                          Max.
                                                                 :96.00
    NA's
                                        (Other): 1853
##
            :9483
                       NA's
                              :3034
##
       MONCIRC
```

```
## Min. : 0.000
## 1st Qu.: 4.000
## Median : 6.000
## Mean : 6.445
## 3rd Qu.: 9.000
## Max. :11.000
```

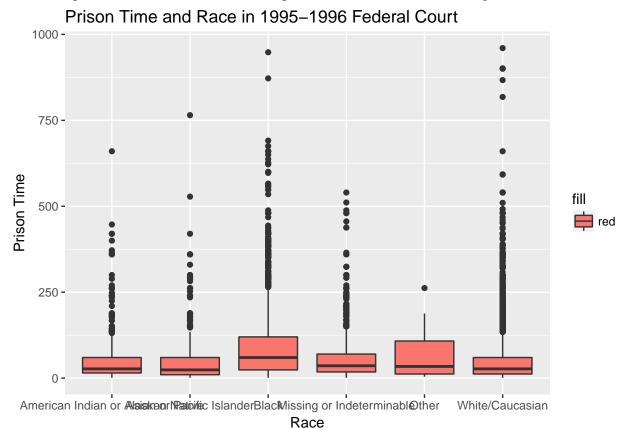
11. Are there any special values in your dataset? If so, what are they and how do you think they got there? The presence of special values is less likely if you haven't performed any data manipulation yet so you should remember to return to this step each time you carry out a mathematical transformation of any values in your dataset.

There are some years where specific values such as time served etc. which I converted them to NAs.

12. Create a boxplot of your data (you can create an individual boxplot for each variable if there are too many variables in your dataset to meaningfully visualize them all in one plot). Are there any outliers? If so, what are they and to which variable do they correspond? Do any of these outliers seem like obvious errors? If so, why?

```
library(ggplot2)
ggplot(data_subset_95_96, aes(x = MONRACE, y = TOTPRISN, fill = "red")) + labs(x = "Race", y = "Prison")
```

Warning: Removed 9483 rows containing non-finite values (stat_boxplot).



13. For any outliers and/or obvious errors, what do you think is the best way to handle them (i.e. remove them entirely, run analyses including and excluding them and compare the results, manually change them to an appropriate measure of center, or something else?).

I have chosen to exclude this completely because they would mess up my model if I code them to - say -1.