Data Cleaning and Analysis of Cervical Cancer Data

Advaith Cheruvu 9/21/2021

Importance of Study

There will be an estimated 14,480 new cases of invasive cervical cancer will be diagnosed and about 4,290 of these women will die from cervical cancer in 2021. This, along with the fact that cervical cancer is frequently diagnosed between the ages of 35-44, shows the importance of studying this disease. As patterns emerge from analyzing the data from susceptible women, we can adapt our health care system to better prevent and treat cervical cancer. For example, by knowing the risk factors, doctors can steer susceptible women away from the risk factors as a measure of prevention. Also, we can critique our current cancer diagnosis techniques so that we know which tests are the most effective and if the medical community needs to develop more accurate tests.

Overview of Cervical Cancer

Cervical cancer is a type of cancer that occurs in a woman's cervix. The main cause of cervical cancer is the human papilomavirus (HPV). Cervical cancer has 2 main types: squamous cell carcinoma and adenocarcinoma. Squamous cell carcinoma begins in the thin flat cells that line the outer part of the cervix. Most cases of cervical cancer are squamous cell carcinomas. Adenocarcinoma begins in the column-shaped glandular cells lining the cervical canal. Both of these forms of cervical cancer produce similar symtoms. Early stages generally have no signs or symptoms, but more advanced cervical cancers may include vaginal bleeding after intercourse, water/bloody vaginal discharge, and pelvic pain or pain during intercourse. Once these symptoms present themselves, the cancer would have already started spreading to nearby tissue and forming a tumor. Eventually, if left untreated, the cancer can spread to the bladder, intestines, bones, lymphnodes, lungs, and liver, leading to death.

HPV

HPV is the main cause of cervical cancer, but it may lie dormant for years before becoming active. Women may contract HPV from sexual intercourse, which may develop into cervical cancer. HPV is very common with at least half of sexually active people contracting it, but only relatively few women will get cervical cancer. In fact, most HPV cases clear within a few months without any intervention and 90% clear within 2 years. The other 10% of cases, however, have a high risk of progressing into cervical cancer. Preventing the transmission and damage done by this STD is crucial to preventing cervical cancer.

Prevention: Vaccination

There are currently 3 vaccines that protect against HPV 16 and HPV 18. This strands are known to cause at least 70% of cervical cancers. The third vaccine protects against 5 additional types of oncogenic HPV strands, which cause another 20% of cervical cancers. Also, two of the vaccines protect against HPV 6 and HPV 11, which are known to cause anogenital warts. These vaccines are best adminstered prior to the exposure of HPV, which is the reasoning behind vaccinating girls aged 9 to 14, before most have started sexual activity. These vaccines cannot treat an ongoing HPV infection or HPV-associated diseases. Though these vaccines are effective, it does not replace cervical cancer screenings.

Prevention: Screening

Cervical cancer screenings involve testing for pre-cancer and cancer in healthy women who have no symptoms. When screenings detect an HPV infection or pre-cancerous lesions, they can be easily treated and the risk of cancer can be avoided. Even screenings that detect cancer at an early stage has a high potential for effective treatment and cure. Screening is recomended for women aged 30 at regular intervals since HPV takes may take many years to progress.

Prevention: Abstinence

Since HPV is a sexually transmitted disease (STD), abstinence is the most effective prevention measure against HPV and cervical cancer. Limiting sexual partners and maintaining sexual activies in a long-term monogamous relationship reduces the risk of spreading HPV. Safe, protective sex can also reduce the risk of spreading HPV, but the other methods discussed earlier are more effective since HPV spreads very quickly during sexually intercourse.

Hinselmann Test

The Hinselmann test tests for cervical cancer by examining cells on colposcope. The colposcope gathers a sample of cells from the cervix and tests for cancerous growths. This test can diagnose cervical cancer and is done if the patient is showing symptoms or suspected to have cervical cancer based on the discretion of the personal care provider.

Schiller Test

The Schiller test tests for cervical cancer by applying iodine to the cervix. The iodine stains healthy cells brown, leaving abnormal cells unstained, usually appearing white or yellow. This test is mainly for larger, more noticeable cancer, allowing doctors to confirm the diagnosis of cervical cancer.

Cytosis

The cytology test includes a pap test or pap smear where the physician will gently remove cells from the cervix so that they may be checked under a microscope. Pap smears are the most common form of screening/diagnosing for cervical cancer due to the cost and ease of the procedure.

Biopsy

A cervical biopsy remove a sample of tissue for testing using a variety of techniques to obtain the sample. Punch biopsy uses a circular blade to obtain a hole-shaped piece of tissue, cone biopsy uses a laser or scalpel to remove a cone-shaped piece of tissue, and endocervical curettage (ECC) uses a curette to scape the inner lining of the endocervical canal.

Introduction to the Dataset

As mentioned earlier, cervical cancer is important to study; especially the data associated with susceptible women. The dataset I will be analyzing will be from the 8th Iberian Pattern Recognition and Image Analsis Conference. This dataset studied 858 women and some of the symptoms and behaviors of women that put them at risk cervical cancer or other similar diseases. I will go through the steps I took to clean and analyze the data.

Setting up Workspace and Installing Packages

The code below shows the preparation of the workspace and cleaning up the environment, as well as installing and loading packages. "tidyverse" is an important package that includes "dplyr" which helps with data science work. Some of the organizational tools and commands from "dplyr" will be shown later. Note that the "install.packages("tidyverse")" line is commented because this package has already been installed on this machine.

```
#
# Clean up and set up
rm(list=ls())
setwd("/Users/advai/Documents/DSFS")
#
# install and load libraries
library(tidyverse)
```

```
## -- Attaching packages ----- tidyverse 1.3.1 --
```

```
## v ggplot2 3.3.5 v purrr 0.3.4

## v tibble 3.1.4 v dplyr 1.0.7

## v tidyr 1.1.3 v stringr 1.4.0

## v readr 2.0.1 v forcats 0.5.1
```

```
## -- Conflicts ------ tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag() masks stats::lag()
```

```
library(stringr)
source("myfunctions.R")
```

Loading and Looking at Cervical Cancer Data

After reading the cervical cancer data into R studio, I can look at it using a variety of commands. The most important commands are "summary" which reports the quartile data, "str" which reports the type of data in the dataframe, and "names" which reports the names of the columns of data. Also, the "na.strings" argument replaces the "?" characters with "NA" so that they are easier to work with when I replace missing data.

```
#
# Load cervical cancer data
cervicalCA <- read.csv(file = "C:\\Users\\advai\\Documents\\DSFS\\cervicalCA.csv",header=T, na.strings=c
("?"))
#
# Looking at the data
names(cervicalCA)</pre>
```

```
##
   [1] "Age"
                                              "Number.of.sexual.partners"
   [3] "First.sexual.intercourse"
                                              "Num.of.pregnancies"
   [5] "Smokes"
                                              "Smokes..years."
##
##
   [7] "Smokes..packs.year."
                                              "Hormonal.Contraceptives"
   [9] "Hormonal.Contraceptives..years."
                                              "IUD"
## [11] "IUD..years."
                                              "STDs"
## [13] "STDs..number."
                                              "STDs.condylomatosis"
## [15] "STDs.cervical.condylomatosis"
                                              "STDs.vaginal.condylomatosis"
## [17] "STDs.vulvo.perineal.condylomatosis" "STDs.syphilis"
## [19] "STDs.pelvic.inflammatory.disease"
                                              "STDs.genital.herpes"
## [21] "STDs.molluscum.contagiosum"
                                              "STDs.AIDS"
## [23] "STDs.HIV"
                                              "STDs.Hepatitis.B"
## [25] "STDs.HPV"
                                              "STDs..Number.of.diagnosis"
## [27] "STDs..Time.since.first.diagnosis"
                                              "STDs..Time.since.last.diagnosis"
## [29] "Dx.Cancer"
                                              "Dx.CIN"
                                              "Dx"
## [31] "Dx.HPV"
## [33] "Hinselmann"
                                              "Schiller"
## [35] "Citology"
                                              "Biopsy"
```

summary(cervicalCA)

```
##
                     Number.of.sexual.partners First.sexual.intercourse
         Age
##
    Min.
           :13.00
                            : 1.000
                                                Min.
    1st Ou.:20.00
                     1st Ou.: 2.000
                                                 1st Ou.:15
##
                                                Median :17
    Median :25.00
                     Median : 2.000
##
##
    Mean
          :26.82
                     Mean : 2.528
                                                Mean
                                                        :17
    3rd Qu.:32.00
                     3rd Qu.: 3.000
                                                 3rd Qu.:18
##
##
    Max.
           :84.00
                     Max.
                            :28.000
                                                Max.
                                                        :32
##
                     NA's
                            :26
                                                NA's
                                                        :7
##
    Num.of.pregnancies
                            Smokes
                                          Smokes..years.
                                                           Smokes..packs.year.
          : 0.000
                        Min.
                                :0.0000
                                          Min. : 0.00
                                                                 : 0.0000
##
                                                           Min.
    1st Qu.: 1.000
                        1st Ou.:0.0000
                                          1st Qu.: 0.00
                                                           1st Ou.: 0.0000
##
                        Median :0.0000
                                          Median : 0.00
    Median : 2.000
                                                           Median : 0.0000
##
                               :0.1456
          : 2.276
                        Mean
                                          Mean
                                                : 1.22
                                                           Mean
                                                                 : 0.4531
##
    Mean
    3rd Ou.: 3.000
                        3rd Ou.:0.0000
                                          3rd Ou.: 0.00
                                                           3rd Ou.: 0.0000
##
##
    Max.
           :11.000
                        Max.
                                :1.0000
                                          Max.
                                                  :37.00
                                                           Max.
                                                                   :37.0000
    NA's
                        NA's
                                          NA's
                                                  :13
                                                           NA's
                                                                   :13
##
           :56
                                :13
##
    Hormonal.Contraceptives Hormonal.Contraceptives..years.
                                                                     IUD
           :0.0000
                                     : 0.000
                                                                       :0.000
##
    Min.
                             Min.
                                                                Min.
    1st Qu.:0.0000
                             1st Qu.: 0.000
                                                                1st Qu.:0.000
##
    Median :1.0000
                             Median : 0.500
                                                               Median :0.000
##
                                                               Mean
    Mean
           :0.6413
                             Mean
                                   : 2.256
                                                                      :0.112
##
##
    3rd Ou.:1.0000
                             3rd Ou.: 3.000
                                                                3rd Ou.:0.000
##
    Max.
           :1.0000
                             Max.
                                     :30.000
                                                                Max.
                                                                       :1.000
                             NA's
    NA's
                                                                NA's
           :108
                                     :108
                                                                       :117
##
                                         STDs..number.
##
     IUD..vears.
                            STDs
                                                           STDs.condylomatosis
                                                                   :0.00000
##
    Min.
           : 0.0000
                       Min.
                               :0.0000
                                         Min.
                                                 :0.0000
                                                           Min.
##
    1st Qu.: 0.0000
                       1st Qu.:0.0000
                                         1st Qu.:0.0000
                                                           1st Qu.:0.00000
    Median : 0.0000
                       Median :0.0000
                                         Median :0.0000
                                                           Median :0.00000
##
##
    Mean
          : 0.5148
                       Mean
                               :0.1049
                                         Mean
                                                :0.1766
                                                           Mean
                                                                   :0.05843
##
    3rd Ou.: 0.0000
                       3rd Ou.:0.0000
                                         3rd Ou.:0.0000
                                                           3rd Ou.:0.00000
    Max.
           :19.0000
                       Max.
                               :1.0000
                                         Max.
                                                 :4.0000
                                                           Max.
                                                                   :1.00000
##
                                         NA's
                                                           NA's
    NA's
                       NA's
            :117
                               :105
                                                 :105
                                                                   :105
##
    STDs.cervical.condylomatosis STDs.vaginal.condylomatosis
##
##
    Min.
                                   Min.
                                          :0.00000
    1st Ou.:0
##
                                   1st Qu.:0.00000
    Median :0
                                   Median :0.00000
##
##
    Mean
           :0
                                   Mean
                                          :0.00531
    3rd Qu.:0
##
                                   3rd Qu.:0.00000
##
    Max.
            :0
                                   Max.
                                          :1.00000
    NA's
            :105
                                   NA's
                                          :105
##
##
    STDs.vulvo.perineal.condylomatosis STDs.syphilis
##
           :0.0000
                                         Min.
                                                :0.0000
##
    1st Qu.:0.0000
                                         1st Qu.:0.0000
    Median :0.0000
                                         Median :0.0000
##
##
    Mean
           :0.0571
                                         Mean
                                                :0.0239
##
    3rd Ou.:0.0000
                                         3rd Ou.:0.0000
##
    Max.
           :1.0000
                                         Max.
                                                 :1.0000
##
    NA's
            :105
                                         NA's
                                                 :105
    STDs.pelvic.inflammatory.disease STDs.genital.herpes
##
##
    Min.
            :0.00000
                                       Min.
                                              :0.00000
##
    1st Qu.:0.00000
                                       1st Qu.:0.00000
    Median :0.00000
                                       Median :0.00000
##
##
    Mean
           :0.00133
                                       Mean
                                              :0.00133
##
    3rd Ou.:0.00000
                                       3rd Ou.:0.00000
##
    Max.
           :1.00000
                                               :1.00000
                                       Max.
                                       NA's
##
    NA's
            :105
                                               :105
    STDs.molluscum.contagiosum
                                   STDs.AIDS
                                                                 STDs.Hepatitis.B
                                                   STDs.HIV
```

```
##
    Min.
           :0.00000
                                 Min.
                                         :0
                                                Min.
                                                        :0.0000
                                                                  Min.
                                                                          :0.00000
##
    1st Ou.:0.00000
                                 1st Qu.:0
                                                1st Ou.:0.0000
                                                                  1st Ou.:0.00000
    Median :0.00000
##
                                 Median :0
                                                Median :0.0000
                                                                  Median :0.00000
##
    Mean
           :0.00133
                                 Mean
                                        :0
                                                Mean
                                                        :0.0239
                                                                  Mean
                                                                          :0.00133
##
    3rd Ou.:0.00000
                                 3rd Qu.:0
                                                3rd Qu.:0.0000
                                                                  3rd Ou.:0.00000
##
    Max.
            :1.00000
                                 Max.
                                         :0
                                                Max.
                                                        :1.0000
                                                                  Max.
                                                                          :1.00000
    NA's
                                 NA's
                                                NA's
##
            :105
                                         :105
                                                        :105
                                                                  NA's
                                                                          :105
##
       STDs.HPV
                       STDs...Number.of.diagnosis STDs...Time.since.first.diagnosis
                               :0.00000
                                                           : 1.000
##
    Min.
           :0.00000
                       Min.
                                                   Min.
    1st Qu.:0.00000
                                                   1st Qu.: 2.000
##
                       1st Qu.:0.00000
##
    Median :0.00000
                       Median :0.00000
                                                   Median : 4.000
    Mean
           :0.00266
                       Mean
                               :0.08741
                                                   Mean
                                                           : 6.141
##
                                                   3rd Qu.: 8.000
##
    3rd Qu.:0.00000
                       3rd Qu.:0.00000
##
    Max.
           :1.00000
                       Max.
                               :3.00000
                                                   Max.
                                                           :22.000
##
    NA's
           :105
                                                   NA's
                                                           :787
##
    STDs..Time.since.last.diagnosis
                                        Dx.Cancer
                                                              Dx.CIN
##
    Min.
           : 1.000
                                      Min.
                                              :0.00000
                                                         Min.
                                                                 :0.00000
    1st Qu.: 2.000
                                      1st Qu.:0.00000
##
                                                         1st Qu.:0.00000
##
    Median : 3.000
                                      Median :0.00000
                                                         Median :0.00000
    Mean
           : 5.817
                                      Mean
                                              :0.02098
                                                         Mean
                                                                 :0.01049
##
    3rd Qu.: 7.500
##
                                      3rd Qu.:0.00000
                                                         3rd Qu.:0.00000
##
    Max.
           :22.000
                                      Max.
                                              :1.00000
                                                         Max.
                                                                 :1.00000
##
    NA's
           :787
##
        Dx.HPV
                                             Hinselmann
                                                                 Schiller
                              Dx
    Min.
##
           :0.00000
                       Min.
                               :0.00000
                                          Min.
                                                  :0.00000
                                                              Min.
                                                                      :0.00000
##
    1st Qu.:0.00000
                       1st Qu.:0.00000
                                          1st Qu.:0.00000
                                                              1st Qu.:0.00000
##
    Median :0.00000
                       Median :0.00000
                                          Median :0.00000
                                                              Median :0.00000
##
    Mean
           :0.02098
                       Mean
                               :0.02797
                                          Mean
                                                  :0.04079
                                                              Mean
                                                                      :0.08625
    3rd Ou.:0.00000
                       3rd Qu.:0.00000
                                           3rd Qu.:0.00000
                                                              3rd Qu.:0.00000
##
##
    Max.
           :1.00000
                       Max.
                               :1.00000
                                          Max.
                                                  :1.00000
                                                              Max.
                                                                      :1.00000
##
##
       Citology
                            Biopsy
##
    Min.
           :0.00000
                               :0.0000
                       Min.
##
    1st Qu.:0.00000
                       1st Qu.:0.0000
##
    Median :0.00000
                       Median :0.0000
##
    Mean
            :0.05128
                       Mean
                               :0.0641
##
    3rd Qu.:0.00000
                       3rd Qu.:0.0000
##
    Max.
           :1.00000
                       Max.
                               :1.0000
##
```

```
str(cervicalCA)
```

```
## 'data.frame':
                 858 obs. of 36 variables:
   $ Age
                                  : int 18 15 34 52 46 42 51 26 45 44 ...
   $ Number.of.sexual.partners
                                  : int 4 1 1 5 3 3 3 1 1 3 ...
##
   $ First.sexual.intercourse
                                        15 14 NA 16 21 23 17 26 20 15 ...
##
                                  : int
  $ Num.of.pregnancies
##
                                  : int
                                       1 1 1 4 4 2 6 3 5 NA ...
##
   $ Smokes
                                  : int
                                        0001001001...
  $ Smokes..years.
                                        0 0 0 37 0 ...
##
                                  : num
##
  $ Smokes..packs.year.
                                  : num
                                        0 0 0 37 0 0 3.4 0 0 2.8 ...
                                  : int 0001100100...
##
   $ Hormonal.Contraceptives
   $ Hormonal.Contraceptives..years.
                                        0 0 0 3 15 0 0 2 0 0 ...
                                  : num
  $ IUD
                                        000000110NA...
##
                                  : int
  $ IUD..years.
                                        000000770NA...
##
                                  : num
## $ STDs
                                        0000000000...
                                  : int
##
  $ STDs..number.
                                        0000000000...
                                  : int
  $ STDs.condylomatosis
                                  : int
                                        0000000000...
## $ STDs.cervical.condylomatosis
                                  : int 0000000000...
## $ STDs.vaginal.condylomatosis
                                  : int 0000000000...
## $ STDs.vulvo.perineal.condylomatosis: int 0000000000...
## $ STDs.syphilis
                                  : int
                                        0000000000...
##
  $ STDs.pelvic.inflammatory.disease : int 00000000000...
## $ STDs.genital.herpes
                                  : int 0000000000...
##
  $ STDs.molluscum.contagiosum
                                  : int
                                        0000000000...
## $ STDs.AIDS
                                        0000000000...
                                  : int
## $ STDs.HIV
                                  : int
                                        0000000000...
##
  $ STDs.Hepatitis.B
                                  : int
                                        0000000000...
## $ STDs.HPV
                                  : int 0000000000...
  $ STDs..Number.of.diagnosis
                                  : int 0000000000...
##
## $ STDs..Time.since.first.diagnosis : int NA ...
## $ STDs..Time.since.last.diagnosis
                                  : int NA NA NA NA NA NA NA NA NA ...
   $ Dx.Cancer
                                        0001000010...
##
                                  : int
  $ Dx.CIN
                                  : int 0000000000...
  $ Dx.HPV
                                  : int
                                        0001000010...
##
##
   $ Dx
                                  : int 000000010...
##
  $ Hinselmann
                                        0000001000...
  $ Schiller
                                        0000001000...
##
                                  : int
  $ Citology
                                  : int 0000000000...
##
##
  $ Biopsy
                                  : int 0000001000...
dim(cervicalCA)
## [1] 858 36
class(cervicalCA)
```

```
file:///C:/Users/advai/Documents/DSFS/WK5L2Cheruvu.html
```

[1] "data.frame"

glimpse(cervicalCA)

```
## Rows: 858
## Columns: 36
                                      <int> 18, 15, 34, 52, 46, 42, 51, 26, 45,~
## $ Age
## $ Number.of.sexual.partners
                                      <int> 4, 1, 1, 5, 3, 3, 1, 1, 3, 3, 1,~
## $ First.sexual.intercourse
                                      <int> 15, 14, NA, 16, 21, 23, 17, 26, 20,~
## $ Num.of.pregnancies
                                      <int> 1, 1, 1, 4, 4, 2, 6, 3, 5, NA, 4, 3~
## $ Smokes
                                      <int> 0, 0, 0, 1, 0, 0, 1, 0, 0, 1, 0, 0,~
## $ Smokes..years.
                                      <dbl> 0.000000, 0.000000, 0.000000, 37.00~
## $ Smokes..packs.year.
                                      <dbl> 0.0, 0.0, 0.0, 37.0, 0.0, 0.0, 3.4,~
## $ Hormonal.Contraceptives
                                      <int> 0, 0, 0, 1, 1, 0, 0, 1, 0, 0, 1, 1,~
                                      <dbl> 0.00, 0.00, 0.00, 3.00, 15.00, 0.00~
## $ Hormonal.Contraceptives..years.
## $ IUD
                                      <int> 0, 0, 0, 0, 0, 1, 1, 0, NA, 0, 0~
## $ IUD..years.
                                      <dbl> 0, 0, 0, 0, 0, 0, 7, 7, 0, NA, 0, 0~
## $ STDs
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs..number.
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs.condylomatosis
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs.cervical.condylomatosis
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs.vaginal.condylomatosis
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs.syphilis
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs.pelvic.inflammatory.disease
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs.genital.herpes
## $ STDs.molluscum.contagiosum
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs.AIDS
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs.HIV
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs.Hepatitis.B
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs.HPV
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs..Number.of.diagnosis
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ STDs..Time.since.first.diagnosis
                                      ## $ STDs..Time.since.last.diagnosis
                                      <int> NA, NA, NA, NA, NA, NA, NA, NA, NA,~
## $ Dx.Cancer
                                      <int> 0, 0, 0, 1, 0, 0, 0, 0, 1, 0, 0, ~
## $ Dx.CIN
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
## $ Dx.HPV
                                      <int> 0, 0, 0, 1, 0, 0, 0, 0, 1, 0, 0, ~
## $ Dx
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 1, 0, 0, ~
                                      <int> 0, 0, 0, 0, 0, 1, 0, 0, 0, 0, ~
## $ Hinselmann
## $ Schiller
                                      <int> 0, 0, 0, 0, 0, 1, 0, 0, 0, 0, ~
## $ Citology
                                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, ~
                                      <int> 0, 0, 0, 0, 0, 1, 0, 0, 0, 0, ~
## $ Biopsy
```

head(cervicalCA)

```
##
     Age Number.of.sexual.partners First.sexual.intercourse Num.of.pregnancies
## 1
                                    1
## 2
      15
                                                              14
                                                                                    1
      34
                                    1
                                                              NA
                                                                                    1
## 3
                                    5
## 4
      52
                                                              16
                                    3
## 5
      46
                                                              21
                                    3
      42
                                                              23
## 6
     Smokes Smokes..years. Smokes..packs.year. Hormonal.Contraceptives
##
## 1
                           0
                                                 0
## 2
           0
                           0
                                                                           0
## 3
           0
                           0
                                                 0
                                                                           0
                          37
## 4
           1
                                                37
                                                                           1
## 5
           0
                           0
                                                 0
## 6
                           0
     Hormonal.Contraceptives..years. IUD IUD..years. STDs STDs..number.
                                      0
                                                             0
## 1
## 2
                                      0
                                          0
                                                        0
                                                             0
                                                                            0
## 3
                                      0
                                                             0
## 4
                                      3
                                          0
                                                        0
                                                             0
                                                                            0
## 5
                                     15
                                          0
                                                             0
                                                                            0
## 6
                                      0
                                          0
                                                        0
                                                             0
                                                                            0
##
     STDs.condylomatosis STDs.cervical.condylomatosis STDs.vaginal.condylomatosis
## 1
                         0
                                                         0
                                                                                        0
## 2
## 3
                                                         0
                                                                                        0
## 4
                                                         0
                                                         0
## 5
## 6
                                                                                        0
##
     STDs.vulvo.perineal.condylomatosis STDs.syphilis
## 1
## 2
                                         0
                                                         0
                                         0
                                                         0
## 3
## 4
                                         0
                                                         0
## 5
## 6
     STDs.pelvic.inflammatory.disease STDs.genital.herpes
##
## 1
## 2
                                                             0
## 3
                                                             0
## 4
                                                             0
## 5
## 6
##
     STDs.molluscum.contagiosum STDs.AIDS STDs.HIV STDs.Hepatitis.B STDs.HPV
## 1
                                0
                                           0
                                                     0
                                                                        0
                                                                                  0
## 2
                                0
                                           0
                                                     0
                                                                        0
                                                                                  0
## 3
                                 0
                                           0
                                                     0
                                                                        0
                                                                                  0
## 4
                                                                        0
                                                                                  0
                                0
                                           0
                                                     0
                                                                        0
                                                                                  0
## 5
## 6
                                0
                                           0
                                                     0
     STDs..Number.of.diagnosis STDs..Time.since.first.diagnosis
##
## 1
                                                                   NA
## 2
                                0
                                                                   NA
## 3
                               0
                                                                  NA
## 4
                                0
                                                                   NA
## 5
                                0
                                                                   NA
## 6
     STDs..Time.since.last.diagnosis Dx.Cancer Dx.CIN Dx.HPV Dx Hinselmann
```

```
## 1
                                                   0
                                                                  0
                                      NA
## 2
                                      NA
                                                   0
                                                          0
## 3
                                      NA
                                                   0
                                                                   0 0
                                                                                   0
                                                          0
## 4
                                                   1
                                                                  1 0
                                                                                   а
                                      NA
## 5
                                      NA
                                                  0
                                                          0
                                                                  0 0
                                                                                   0
## 6
                                      NA
##
     Schiller Citology Biopsy
                       0
## 1
             0
             0
                       0
                               0
## 2
## 3
             0
## 4
             0
## 5
             0
                               0
## 6
```

As you can see, these commands provide useful information about the quality of the data as well as what the data is.

Replacing Column Names

Based on the "names" command from earlier, the column names of the data in this dataset is very ambiguous. By using a "dplyr" command "rename" we can rename the columns so that it is easier to read.

```
#
# Cleaning up the column names
names(cervicalCA) <- c("age", "sexual_partners","first_intercourse", "pregnancies", "smokes", "smoking_t
ime", "smoke_rate", "hormomal_contraceptives", "hormonal_contraceptives_time", "iud", "iud_time", "std",
"std_time", "condylomatosis", "cervical_condylomatosis", "vaginal_condylomatosis", "vulvo_perineal_condy
lomatosis", "syphilis", "pelvic_inflammatory_disease", "genital_herpes", "molluscum_contagiosm", "aids",
"hiv", "hepatitis_b", "hpv", "diagnosis_num", "first_diagnosis_time", "last_diagnosis_time", "dx_cancer"
, "dx_cin", "dx_hpv", "dx", "hinselmann", "schiller", "cytology", "biopsy")</pre>
```

Though this looks complicated, all this is doing is converting the old ambiguous column names to something more understandable.

```
#
# renamed columns
names(cervicalCA)
```

```
"sexual_partners"
   [1] "age"
##
   [3] "first intercourse"
                                          "pregnancies"
##
##
   [5] "smokes"
                                          "smoking time"
   [7] "smoke_rate"
                                          "hormomal_contraceptives"
##
                                          "iud"
   [9] "hormonal_contraceptives_time"
## [11] "iud time"
## [13] "std time"
                                          "condylomatosis"
## [15] "cervical_condylomatosis"
                                          "vaginal_condylomatosis"
## [17] "vulvo_perineal_condylomatosis"
                                         "syphilis"
## [19] "pelvic inflammatory disease"
                                          "genital herpes"
## [21] "molluscum contagiosm"
                                          "aids"
## [23] "hiv"
                                          "hepatitis b"
## [25] "hpv"
                                          "diagnosis num"
## [27] "first_diagnosis_time"
                                          "last_diagnosis_time"
## [29] "dx_cancer"
                                          "dx_cin"
                                          "dx"
## [31] "dx hpv"
## [33] "hinselmann"
                                          "schiller"
## [35] "cytology"
                                          "biopsy"
```

Checking for Missing Data

Most columns have missing data, either as "NA" or data that just doesn't make sense. I can check for missing data using the commands below which print the rows with missing data. After knowing that I have missing data, I can run the command below which tells me which columns have missing data.

```
#
# Check for missing data
clean <- ifelse(complete.cases(cervicalCA) == TRUE, 1, 0)
paste("There are", dim(cervicalCA)[1]-sum(clean), "rows with missing data.")</pre>
```

```
## [1] "There are 799 rows with missing data."
```

```
#
# Find which columns have missing data
missingDataCol <-colnames(cervicalCA)[apply(cervicalCA, 2, anyNA)]
paste0("The following columns have missing data: ", missingDataCol)</pre>
```

```
[1] "The following columns have missing data: sexual_partners"
##
   [2] "The following columns have missing data: first_intercourse"
   [3] "The following columns have missing data: pregnancies"
   [4] "The following columns have missing data: smokes"
   [5] "The following columns have missing data: smoking_time"
   [6] "The following columns have missing data: smoke_rate"
   [7] "The following columns have missing data: hormomal contraceptives"
##
   [8] "The following columns have missing data: hormonal_contraceptives_time"
   [9] "The following columns have missing data: iud"
## [10] "The following columns have missing data: iud_time"
## [11] "The following columns have missing data: std"
## [12] "The following columns have missing data: std_time"
## [13] "The following columns have missing data: condylomatosis"
## [14] "The following columns have missing data: cervical_condylomatosis"
## [15] "The following columns have missing data: vaginal condylomatosis"
## [16] "The following columns have missing data: vulvo_perineal_condylomatosis"
## [17] "The following columns have missing data: syphilis"
## [18] "The following columns have missing data: pelvic inflammatory disease"
## [19] "The following columns have missing data: genital herpes"
## [20] "The following columns have missing data: molluscum_contagiosm"
## [21] "The following columns have missing data: aids"
## [22] "The following columns have missing data: hiv"
## [23] "The following columns have missing data: hepatitis_b"
## [24] "The following columns have missing data: hpv"
## [25] "The following columns have missing data: first diagnosis time"
## [26] "The following columns have missing data: last diagnosis time"
```

Replacing Missing Data

Most of this data is Boolean, so the logical replacement for missing data would be "0". However, for the numerical data, I can replace the missing values with the mean of the existing values.

```
#
# Replacing the missing data with the mean for
# appropriate columns
# Replacing sexual partners data
cervicalCA$sexual_partners <- ifelse(is.na(cervicalCA$sexual_partners), round(mean(cervicalCA$sexual_partners, na.rm=TRUE),0), cervicalCA$sexual_partners)
#
# Replacing first_intercourse data
cervicalCA$first_intercourse <- ifelse(is.na(cervicalCA$first_intercourse), round(mean(cervicalCA$first_intercourse, na.rm=TRUE),0), cervicalCA$first_intercourse)
#
# Replacing pregnancies data
cervicalCA$pregnancies <- ifelse(is.na(cervicalCA$pregnancies), round(mean(cervicalCA$pregnancies, na.rm=TRUE),0), cervicalCA$pregnancies)</pre>
```

Now I can replace the Boolean variables

```
#
# Replacing the other missing data with 0
cervicalCA[is.na(cervicalCA)] = 0
```

Other clean up

After looking at the data after the prior changes, I noticed that some of the columns were in integers instead of Boolean. I also fixed the rounding issues that occurred when I replaced the missing numerical data with the mean.

```
#
# Replacing integer data as boolean where appropriate
logicals <- c("smokes", "iud", "std", "condylomatosis", "vaginal_condylomatosis", "vulvo_perineal_condyl
omatosis", "syphilis", "pelvic_inflammatory_disease", "genital_herpes", "molluscum_contagiosm", "aids",
"hiv", "hepatitis_b", "hpv", "dx_cancer", "dx_cin", "dx_hpv", "dx", "hinselmann", "schiller", "cytology"
, "biopsy")
cervicalCA[logicals] <- lapply(cervicalCA[logicals], as.logical)
#
# Round values in columns with many digits
cervicalCA$smoking_time <- round(cervicalCA$smoking_time, 3)
cervicalCA$smoke_rate <- round(cervicalCA$smoke_rate, 3)
cervicalCA$hormonal_contraceptives_time <- round(cervicalCA$hormonal_contraceptives_time, 3)</pre>
```

Now I can check my data set before I continue.

```
summary(cervicalCA)
```

```
##
                    sexual_partners
                                     first_intercourse pregnancies
         age
##
   Min.
           :13.00
                    Min. : 1.000
                                      Min.
                                             :10
                                                        Min. : 0.000
                    1st Ou.: 2.000
   1st Ou.:20.00
                                      1st Ou.:15
                                                        1st Ou.: 1.000
##
                                                        Median : 2.000
   Median :25.00
                    Median : 2.000
                                     Median :17
##
##
   Mean
         :26.82
                    Mean : 2.542
                                     Mean :17
                                                        Mean : 2.258
    3rd Qu.:32.00
                    3rd Qu.: 3.000
                                      3rd Qu.:18
                                                        3rd Qu.: 3.000
##
          :84.00
##
   Max.
                    Max.
                           :28.000
                                      Max.
                                             :32
                                                        Max.
                                                               :11.000
##
     smokes
                     smoking_time
                                        smoke_rate
                                                        hormomal_contraceptives
##
   Mode :logical
                    Min.
                           : 0.000
                                      Min.
                                             : 0.0000
                                                        Min.
                                                               :0.0000
    FALSE:735
                    1st Ou.: 0.000
                                      1st Ou.: 0.0000
                                                        1st Qu.:0.0000
##
    TRUE :123
                    Median : 0.000
                                      Median : 0.0000
                                                        Median :1.0000
##
##
                    Mean
                          : 1.201
                                            : 0.4463
                                                        Mean
                                                               :0.5606
                                     Mean
##
                    3rd Qu.: 0.000
                                      3rd Qu.: 0.0000
                                                        3rd Qu.:1.0000
##
                    Max.
                           :37.000
                                      Max.
                                             :37.0000
                                                        Max.
                                                               :1.0000
##
   hormonal contraceptives time
                                     iud
                                                     iud time
                                                                       std
         : 0.000
                                 Mode :logical
                                                        : 0.0000
                                                                    Mode :logical
##
   Min.
                                                  Min.
##
   1st Qu.: 0.000
                                 FALSE:775
                                                  1st Qu.: 0.0000
                                                                    FALSE:779
   Median : 0.250
                                 TRUE:83
                                                  Median : 0.0000
                                                                    TRUE :79
##
         : 1.972
                                                  Mean
                                                        : 0.4446
##
   Mean
    3rd Qu.: 2.000
                                                  3rd Qu.: 0.0000
##
##
   Max.
          :30.000
                                                  Max.
                                                         :19.0000
##
       std time
                    condylomatosis cervical condylomatosis vaginal condylomatosis
           :0.000
                    Mode :logical
##
   Min.
                                    Min.
                                           :0
                                                             Mode :logical
   1st Qu.:0.000
                    FALSE:814
                                    1st Qu.:0
                                                             FALSE:854
##
##
   Median :0.000
                    TRUE :44
                                    Median :0
                                                             TRUE:4
           :0.155
##
   Mean
                                    Mean
                                          :0
##
    3rd Qu.:0.000
                                    3rd Qu.:0
   Max.
           :4.000
                                    Max.
##
##
   vulvo_perineal_condylomatosis syphilis
                                                   pelvic_inflammatory_disease
##
   Mode :logical
                                  Mode :logical
                                                   Mode :logical
##
    FALSE:815
                                  FALSE:840
                                                   FALSE:857
   TRUE :43
                                  TRUE :18
                                                   TRUE :1
##
##
##
##
                                             aids
                                                             hiv
##
    genital herpes molluscum contagiosm
                                         Mode :logical
##
   Mode :logical
                    Mode :logical
                                                          Mode :logical
    FALSE:857
                    FALSE:857
                                          FALSE:858
                                                          FALSE:840
##
                                                          TRUE :18
##
   TRUE :1
                    TRUE :1
##
##
##
##
   hepatitis b
                       hpv
                                    diagnosis num
                                                       first diagnosis time
                                          :0.00000
##
   Mode :logical
                    Mode :logical
                                    Min.
                                                       Min. : 0.0000
                                    1st Qu.:0.00000
                                                       1st Qu.: 0.0000
##
    FALSE:857
                    FALSE:856
    TRUE :1
                                    Median :0.00000
                                                       Median : 0.0000
##
                    TRUE :2
##
                                    Mean
                                          :0.08741
                                                       Mean
                                                             : 0.5082
##
                                    3rd Qu.:0.00000
                                                       3rd Qu.: 0.0000
##
                                    Max.
                                            :3.00000
                                                              :22.0000
                                                       Max.
##
   last_diagnosis_time dx_cancer
                                           dx_cin
                                                           dx hpv
##
   Min.
          : 0.0000
                        Mode :logical
                                        Mode :logical
                                                         Mode :logical
    1st Qu.: 0.0000
                        FALSE:840
                                        FALSE:849
                                                         FALSE:840
##
   Median : 0.0000
                        TRUE :18
                                        TRUE:9
                                                         TRUE :18
##
##
   Mean
           : 0.4814
    3rd Qu.: 0.0000
##
           :22.0000
##
   Max.
##
        dх
                                      schiller
                    hinselmann
                                                      cytology
```

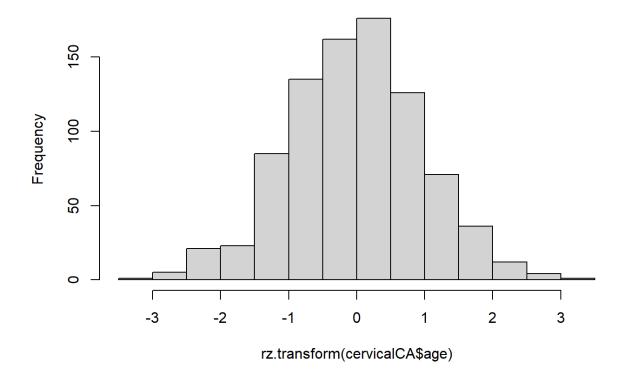
```
Mode :logical
                                     Mode :logical
                                                      Mode :logical
                    Mode :logical
##
    FALSE:834
                     FALSE:823
                                      FALSE:784
                                                      FALSE:814
    TRUE:24
                     TRUE:35
                                      TRUE :74
                                                      TRUE :44
##
##
##
##
      biopsy
##
    Mode :logical
##
    FALSE:803
##
    TRUE:55
##
##
##
##
```

Normalizing data

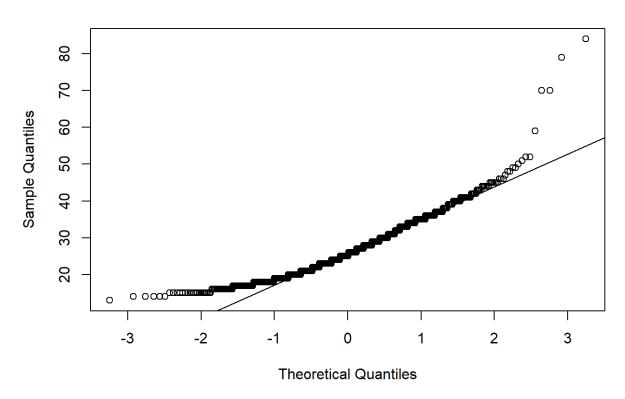
To get a feel for the data, I need to normalize the data. I used a rank z transform to normalize the data for analysis. I also added a column to the dataset for these values.

```
#
# Normal distribution of numerical data
# Checking for age
hist(rz.transform(cervicalCA$age))
```

Histogram of rz.transform(cervicalCA\$age)

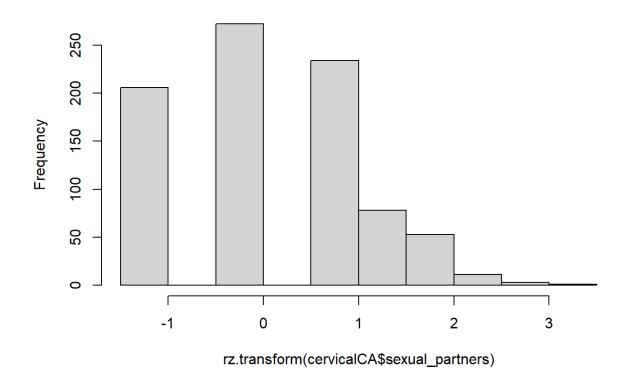


```
qqnorm(cervicalCA$age)
qqline(cervicalCA$age)
```

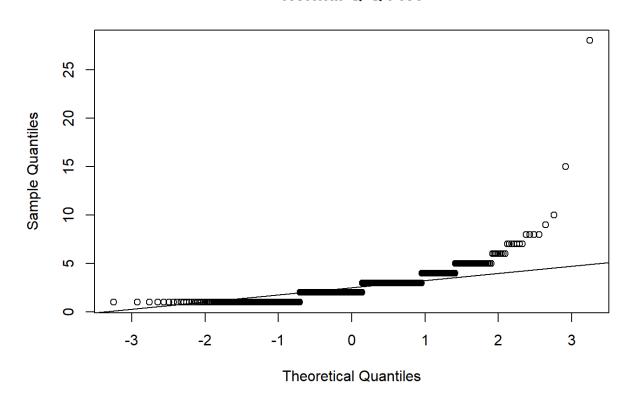


```
cervicalCA$rz_transform_age <- rz.transform(cervicalCA$age)
#
# Checking for sexual_partners
hist(rz.transform(cervicalCA$sexual_partners))</pre>
```

Histogram of rz.transform(cervicalCA\$sexual_partners)

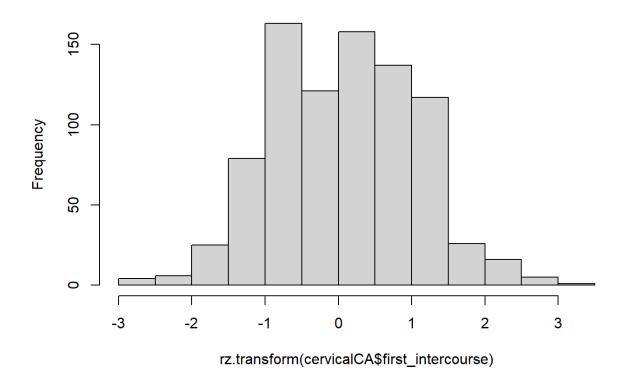


qqnorm(cervicalCA\$sexual_partners)
qqline(cervicalCA\$sexual_partners)

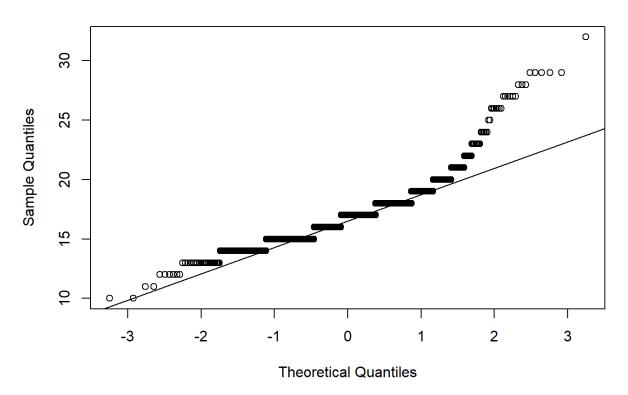


```
cervicalCA$rz_transform_sexual_partners <- rz.transform(cervicalCA$sexual_partners)
#
# Checking for first_intercourse
hist(rz.transform(cervicalCA$first_intercourse))</pre>
```

Histogram of rz.transform(cervicalCA\$first_intercourse)

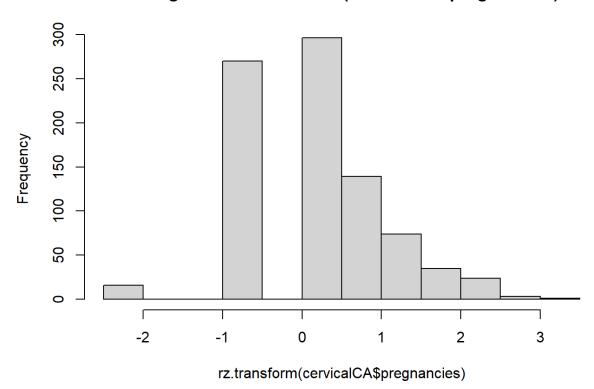


qqnorm(cervicalCA\$first_intercourse)
qqline(cervicalCA\$first_intercourse)

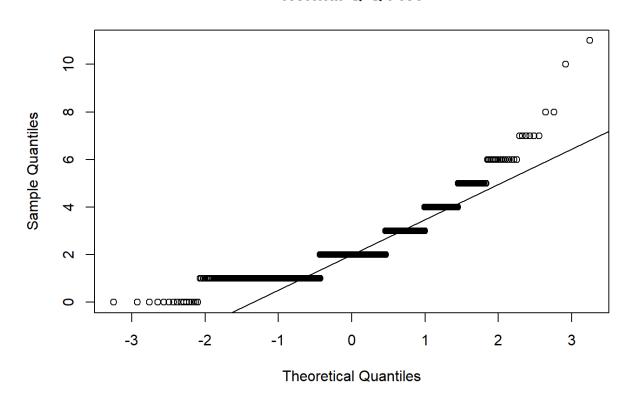


cervicalCA\$rz_transform_first_intercourse <- rz.transform(cervicalCA\$first_intercourse)
#
Checking for pregnancies
hist(rz.transform(cervicalCA\$pregnancies))</pre>

Histogram of rz.transform(cervicalCA\$pregnancies)

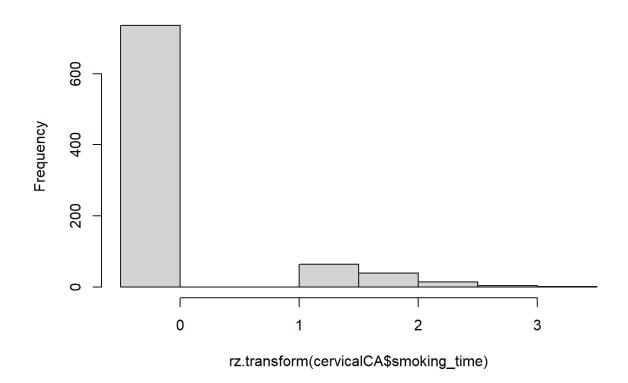


qqnorm(cervicalCA\$pregnancies)
qqline(cervicalCA\$pregnancies)

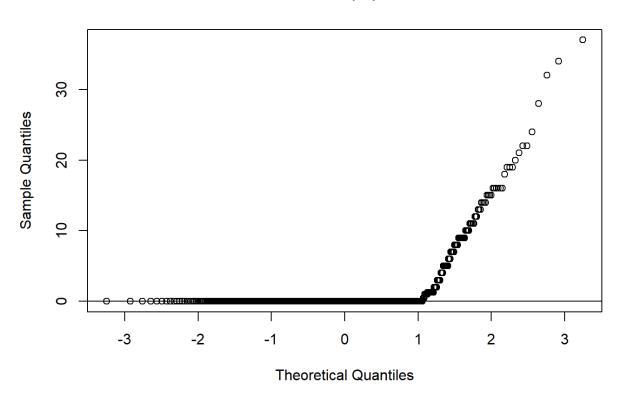


```
cervicalCA$rz_transform_pregnancies <- rz.transform(cervicalCA$pregnancies)
#
# Checking for smoking_time
hist(rz.transform(cervicalCA$smoking_time))</pre>
```

Histogram of rz.transform(cervicalCA\$smoking_time)

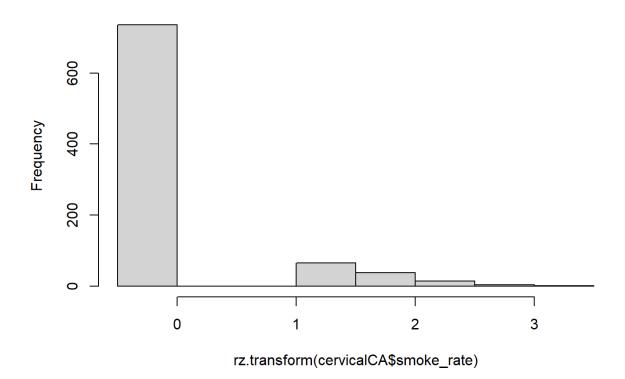


qqnorm(cervicalCA\$smoking_time)
qqline(cervicalCA\$smoking_time)

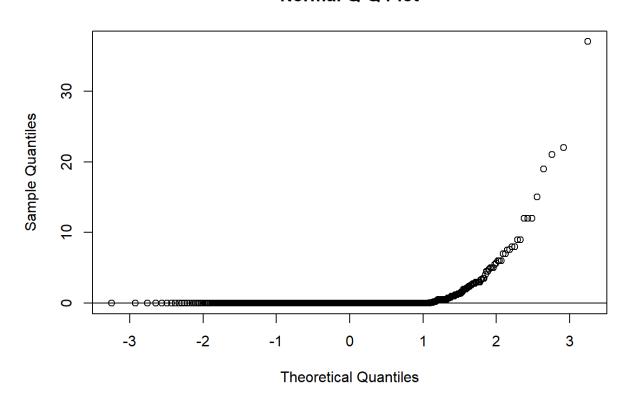


```
cervicalCA$rz_transform_smoking_time <- rz.transform(cervicalCA$smoking_time)
#
# Checking for smoke_rate
hist(rz.transform(cervicalCA$smoke_rate))</pre>
```

Histogram of rz.transform(cervicalCA\$smoke_rate)

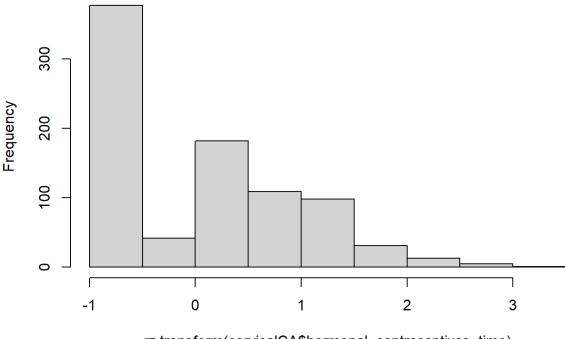


qqnorm(cervicalCA\$smoke_rate)
qqline(cervicalCA\$smoke_rate)



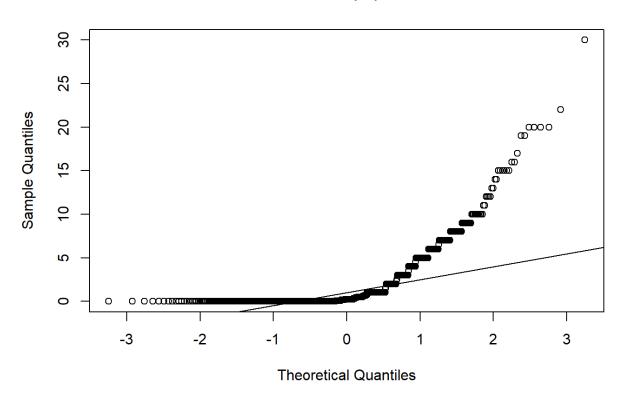
```
cervicalCA$rz_transform_smoke_rate <- rz.transform(cervicalCA$smoke_rate)
#
# Checking for hormonal_contraceptives_time
hist(rz.transform(cervicalCA$hormonal_contraceptives_time))</pre>
```

Histogram of rz.transform(cervicalCA\$hormonal_contraceptives_time)



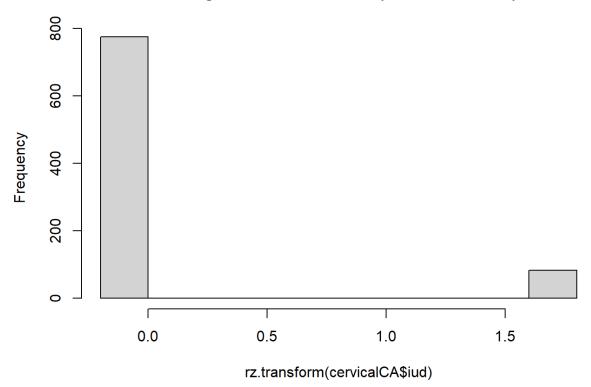
rz.transform(cervicalCA\$hormonal_contraceptives_time)

qqnorm(cervicalCA\$hormonal_contraceptives_time)
qqline(cervicalCA\$hormonal_contraceptives_time)

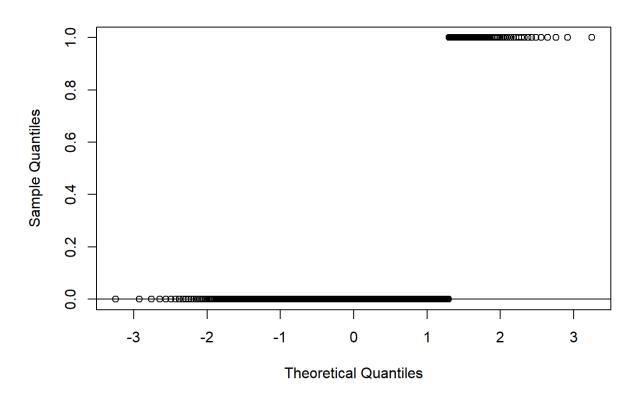


cervicalCA\$rz_transform_hormonal_contraceptives_time <- rz.transform(cervicalCA\$hormonal_contraceptives_
time)
#
Checking for iud
hist(rz.transform(cervicalCA\$iud))</pre>



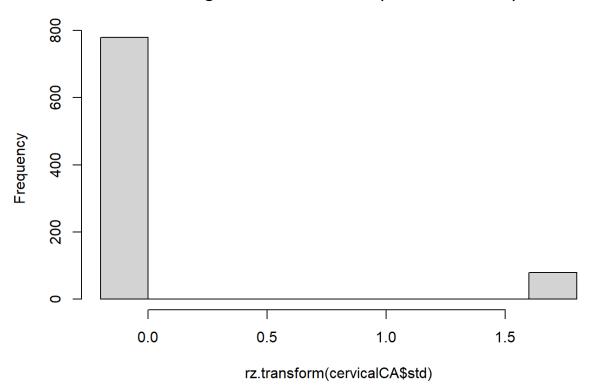


qqnorm(cervicalCA\$iud)
qqline(cervicalCA\$iud)

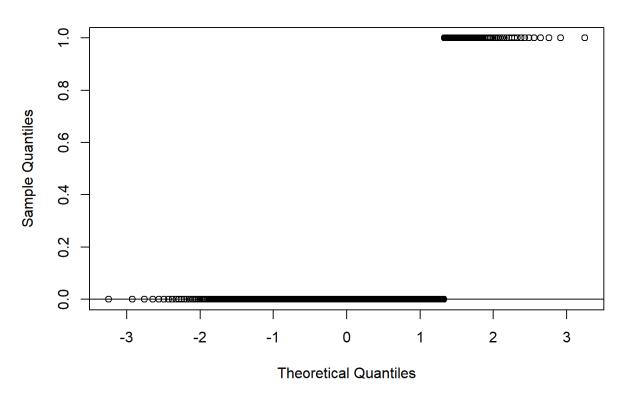


```
cervicalCA$rz_transform_iud <- rz.transform(cervicalCA$iud)
#
# Checking for std
hist(rz.transform(cervicalCA$std))</pre>
```

Histogram of rz.transform(cervicalCA\$std)

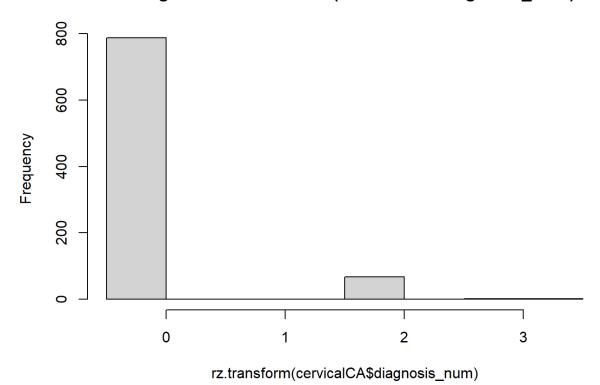


qqnorm(cervicalCA\$std)
qqline(cervicalCA\$std)

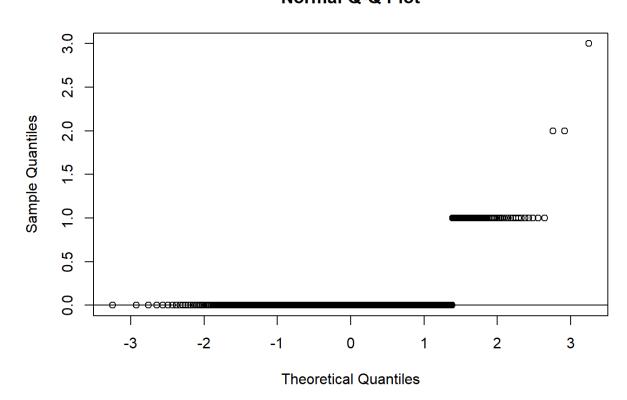


```
cervicalCA$rz_transform_std <- rz.transform(cervicalCA$std)
#
# Checking for diagnosis_num
hist(rz.transform(cervicalCA$diagnosis_num))</pre>
```

Histogram of rz.transform(cervicalCA\$diagnosis_num)

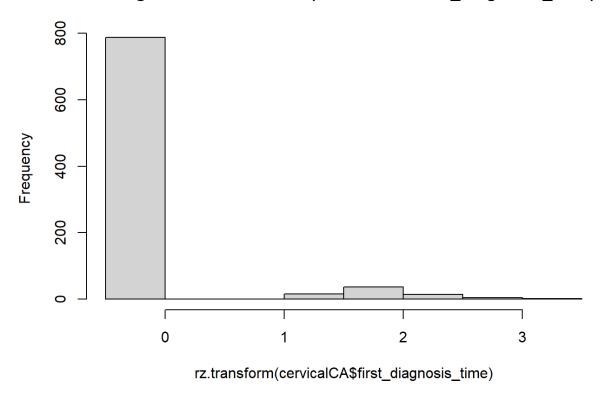


qqnorm(cervicalCA\$diagnosis_num)
qqline(cervicalCA\$diagnosis_num)

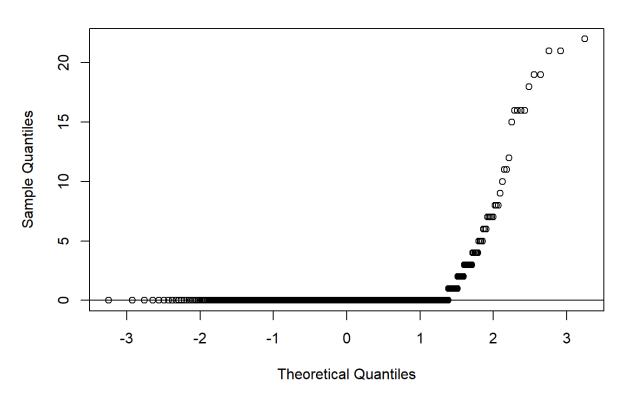


```
cervicalCA$rz_transform_diagnosis_num <- rz.transform(cervicalCA$diagnosis_num)
#
# Checking for first_diagnosis_time
hist(rz.transform(cervicalCA$first_diagnosis_time))</pre>
```

Histogram of rz.transform(cervicalCA\$first_diagnosis_time)

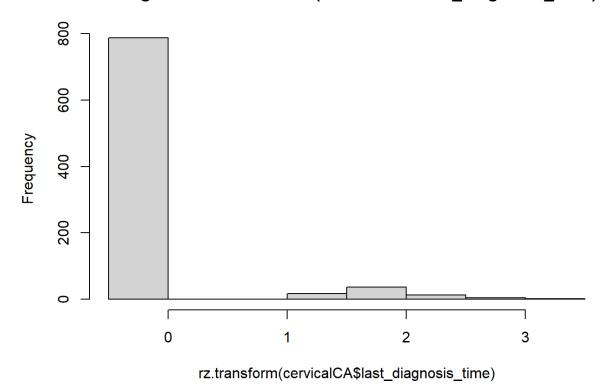


qqnorm(cervicalCA\$first_diagnosis_time)
qqline(cervicalCA\$first_diagnosis_time)

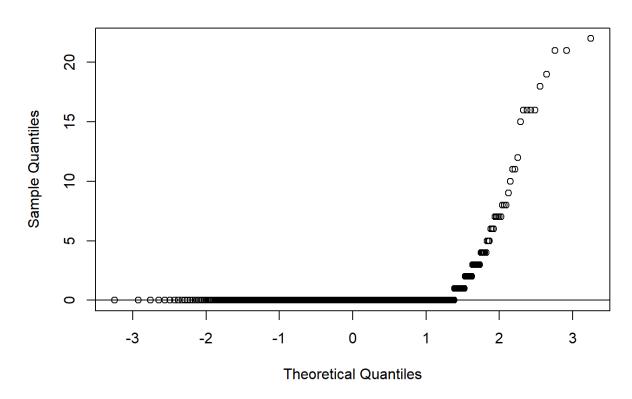


cervicalCA\$rz_transform_first_diagnosis_time <- rz.transform(cervicalCA\$first_diagnosis_time)
#
Checking for Last_diagnosis_time
hist(rz.transform(cervicalCA\$last_diagnosis_time))</pre>

Histogram of rz.transform(cervicalCA\$last_diagnosis_time)



qqnorm(cervicalCA\$last_diagnosis_time)
qqline(cervicalCA\$last_diagnosis_time)



```
cervicalCA$rz_transform_last_diagnosis_time <- rz.transform(cervicalCA$last_diagnosis_time)</pre>
```

Here I export the clean the data to an external file so that I can analyze the data. I have already exported this file so I put the code as a comment.

```
#
# Writing export file
# write.csv(cervicalCA,"/Users/advai/Documents/DSFS/ccdataMod.csv")
```

Loadin the Clean Data

I do the same steps to prepare the work space, load the data, and look at the data.

```
#
# clean up and set up
rm(list=ls())
setwd("/Users/advai/Documents/DSFS")
#
# instalL and load libraries
library(tidyverse)
library(stringr)
source("myfunctions.R")
#
# Load clean Cervical cancer data
cervicalCA <- read.csv(file = "C:\\Users\\advai\\Documents\\DSFS\\ccdataMod.csv",header=T, na.strings=c(
"?"))
#
# Looking at the data
names(cervicalCA)</pre>
```

```
[1] "X"
##
   [2] "age"
   [3] "sexual partners"
##
##
   [4] "first_intercourse"
##
   [5] "pregnancies"
    [6] "smokes"
##
   [7] "smoking time"
##
##
   [8] "smoke_rate"
   [9] "hormomal_contraceptives"
##
## [10] "hormonal contraceptives time"
## [11] "iud"
## [12] "iud_time"
## [13] "std"
## [14] "std time"
## [15] "condylomatosis"
## [16] "cervical_condylomatosis"
## [17] "vaginal_condylomatosis"
## [18] "vulvo perineal condylomatosis"
## [19] "syphilis"
## [20] "pelvic_inflammatory_disease"
## [21] "genital_herpes"
## [22] "molluscum_contagiosm"
## [23] "aids"
## [24] "hiv"
## [25] "hepatitis_b"
## [26] "hpv"
## [27] "diagnosis_num"
## [28] "first_diagnosis_time"
## [29] "last_diagnosis_time"
## [30] "dx_cancer"
## [31] "dx cin"
## [32] "dx_hpv"
## [33] "dx"
## [34] "hinselmann"
## [35] "schiller"
## [36] "cytology"
## [37] "biopsy"
## [38] "rz_transform_age"
## [39] "rz transform sexual partners"
## [40] "rz_transform_first_intercourse"
## [41] "rz_transform_pregnancies"
## [42] "rz_transform_smoking_time"
## [43] "rz_transform_smoke_rate"
## [44] "rz_transform_hormonal_contraceptives_time"
## [45] "rz transform iud"
## [46] "rz_transform_std"
## [47] "rz transform diagnosis num"
## [48] "rz_transform_first_diagnosis_time"
## [49] "rz_transform_last_diagnosis_time"
```

```
summary(cervicalCA)
```

```
##
          Х
                                     sexual_partners
                                                      first_intercourse
                          age
##
         : 1.0
                    Min.
                           :13.00
                                     Min. : 1.000
                                                      Min.
                                                             :10
                                     1st Qu.: 2.000
    1st Ou.:215.2
                    1st Ou.:20.00
                                                      1st Ou.:15
##
    Median :429.5
                    Median :25.00
                                     Median : 2.000
                                                      Median :17
##
##
    Mean
          :429.5
                    Mean :26.82
                                     Mean
                                           : 2.542
                                                      Mean
                                                              :17
    3rd Qu.:643.8
                    3rd Qu.:32.00
                                     3rd Qu.: 3.000
                                                      3rd Qu.:18
##
                           :84.00
##
    Max.
           :858.0
                    Max.
                                     Max.
                                            :28.000
                                                      Max.
                                                              :32
##
     pregnancies
                       smokes
                                       smoking_time
                                                         smoke_rate
##
           : 0.000
                     Mode :logical
                                      Min.
                                             : 0.000
                                                       Min.
                                                              : 0.0000
    Min.
    1st Ou.: 1.000
                     FALSE:735
                                      1st Ou.: 0.000
                                                       1st Ou.: 0.0000
##
                     TRUE :123
                                      Median : 0.000
                                                       Median : 0.0000
##
    Median : 2.000
    Mean
          : 2.258
                                            : 1.201
                                                       Mean
                                                             : 0.4463
##
                                      Mean
    3rd Qu.: 3.000
                                      3rd Qu.: 0.000
                                                       3rd Qu.: 0.0000
##
                                      Max.
                                             :37.000
                                                              :37.0000
##
           :11.000
                                                       Max.
##
    hormomal_contraceptives hormonal_contraceptives_time
                                                              iud
                                  : 0.000
                            Min.
                                                          Mode :logical
##
    Min.
           :0.0000
##
    1st Ou.:0.0000
                             1st Qu.: 0.000
                                                          FALSE:775
    Median :1.0000
                            Median : 0.250
                                                           TRUE :83
##
                                  : 1.972
##
    Mean
           :0.5606
                            Mean
    3rd Qu.:1.0000
                             3rd Qu.: 2.000
##
##
    Max.
          :1.0000
                            Max.
                                    :30.000
##
       iud time
                         std
                                          std time
                                                       condylomatosis
##
   Min.
          : 0.0000
                      Mode :logical
                                       Min.
                                              :0.000
                                                       Mode :logical
    1st Qu.: 0.0000
                      FALSE:779
                                       1st Qu.:0.000
                                                       FALSE:814
##
##
    Median : 0.0000
                      TRUE :79
                                       Median :0.000
                                                       TRUE :44
         : 0.4446
##
    Mean
                                       Mean
                                              :0.155
##
    3rd Qu.: 0.0000
                                       3rd Qu.:0.000
           :19.0000
                                       Max.
                                              :4.000
##
    Max.
##
    cervical_condylomatosis vaginal_condylomatosis vulvo_perineal_condylomatosis
##
    Min.
                            Mode :logical
                                                    Mode :logical
##
    1st Qu.:0
                             FALSE:854
                                                    FALSE:815
    Median :0
                             TRUE:4
                                                    TRUE :43
##
##
    Mean
           .0
##
    3rd Qu.:0
##
    Max.
           :0
     syphilis
                    pelvic inflammatory disease genital herpes
##
##
    Mode :logical
                    Mode :logical
                                                 Mode :logical
    FALSE:840
                    FALSE:857
                                                 FALSE:857
##
##
    TRUE:18
                    TRUE :1
                                                 TRUE :1
##
##
##
##
    molluscum contagiosm
                             aids
                                             hiv
                                                           hepatitis b
##
    Mode :logical
                         Mode :logical
                                          Mode :logical
                                                          Mode :logical
                         FALSE:858
##
    FALSE:857
                                          FALSE:840
                                                           FALSE:857
    TRUE :1
                                          TRUE:18
                                                           TRUE:1
##
##
##
##
##
       hpv
                    diagnosis num
                                       first_diagnosis_time last_diagnosis_time
##
    Mode :logical
                    Min.
                            :0.00000
                                       Min. : 0.0000
                                                             Min.
                                                                  : 0.0000
    FALSE:856
                    1st Qu.:0.00000
                                       1st Qu.: 0.0000
##
                                                             1st Qu.: 0.0000
    TRUE :2
                    Median :0.00000
                                                            Median : 0.0000
##
                                       Median : 0.0000
##
                    Mean
                            :0.08741
                                       Mean : 0.5082
                                                            Mean : 0.4814
##
                    3rd Qu.:0.00000
                                       3rd Qu.: 0.0000
                                                             3rd Qu.: 0.0000
                                              :22.0000
##
                    Max.
                            :3.00000
                                       Max.
                                                             Max.
                                                                    :22.0000
##
                                       dx_hpv
                                                         dx
   dx_cancer
                      dx_cin
```

```
Mode :logical
                                    Mode :logical
                                                     Mode :logical
                    Mode :logical
##
    FALSE:840
                    FALSE:849
                                     FALSE:840
                                                     FALSE:834
    TRUE :18
                    TRUE:9
                                     TRUE :18
                                                     TRUE:24
##
##
##
##
##
    hinselmann
                     schiller
                                      cytology
                                                       biopsy
    Mode :logical
                    Mode :logical
                                    Mode :logical
                                                     Mode :logical
##
    FALSE:823
                    FALSE:784
                                     FALSE:814
                                                     FALSE:803
##
    TRUE:35
                    TRUE :74
                                     TRUE :44
##
                                                     TRUE:55
##
##
##
##
    rz_transform_age
                        rz_transform_sexual_partners
##
    Min.
          :-3.044808
                        Min.
                               :-1.17255
##
    1st Qu.:-0.721968
                        1st Qu.:-0.25666
##
    Median :-0.048167
                        Median :-0.25666
          : 0.001286
                        Mean : 0.02489
##
    Mean
##
    3rd Qu.: 0.675406
                        3rd Qu.: 0.50508
    Max.
          : 3.044808
                        Max.
                               : 3.04481
##
##
    rz_transform_first_intercourse rz_transform_pregnancies
##
   Min.
          :-2.920702
                                   Min.
                                          :-2.33030
##
    1st Qu.:-0.744880
                                    1st Qu.:-0.92930
    Median : 0.140529
                                    Median : 0.01459
##
         : 0.003423
                                         : 0.02305
##
    Mean
                                    Mean
    3rd Ou.: 0.605541
                                    3rd Ou.: 0.70316
##
          : 3.044808
                                    Max.
                                           : 3.04481
##
##
    rz_transform_smoking_time rz_transform_smoke_rate
           :-0.1804
                              Min.
                                      :-0.18044
##
   Min.
##
    1st Qu.:-0.1804
                              1st Ou.:-0.18044
##
    Median :-0.1804
                              Median :-0.18044
          : 0.0702
                              Mean
                                     : 0.07021
##
    Mean
    3rd Qu.:-0.1804
                              3rd Ou.:-0.18044
##
##
    Max.
           : 3.0448
                              Max.
                                      : 3.04481
    rz transform hormonal contraceptives time rz transform iud
##
    Min.
          :-0.77211
                                               Min.
                                                      :-0.12140
##
##
    1st Qu.:-0.77211
                                               1st Qu.:-0.12140
##
    Median: 0.03064
                                               Median :-0.12140
    Mean
          : 0.05307
                                                      : 0.05051
##
                                               Mean
##
    3rd Ou.: 0.60379
                                               3rd Qu.:-0.12140
          : 3.04481
                                                      : 1.65567
##
    Max.
    rz_transform_std
                       rz_transform_diagnosis_num
##
   Min.
          :-0.11552
                       Min.
                             :-0.10378
##
    1st Ou.:-0.11552
                       1st Ou.:-0.10378
##
    Median :-0.11552
                       Median :-0.10378
##
    Mean : 0.04972
                       Mean : 0.05029
##
    3rd Ou.:-0.11552
                       3rd Ou.:-0.10378
##
##
    Max.
          : 1.67911
                       Max.
                             : 3.04481
    rz_transform_first_diagnosis_time rz_transform_last_diagnosis_time
##
##
    Min.
           :-0.10378
                                       Min.
                                              :-0.10378
##
    1st Ou.:-0.10378
                                       1st Ou.:-0.10378
   Median :-0.10378
                                       Median :-0.10378
##
          : 0.05602
                                             : 0.05601
##
    Mean
                                       Mean
##
    3rd Ou.:-0.10378
                                       3rd Ou.:-0.10378
   Max.
           : 3.04481
                                              : 3.04481
                                       Max.
```

```
str(cervicalCA)
```

```
## 'data.frame':
                  858 obs. of 49 variables:
  $ X
                                           : int 1 2 3 4 5 6 7 8 9 10 ...
                                          : int 18 15 34 52 46 42 51 26 45 44 ...
##
  $ age
##
  $ sexual_partners
                                           : int 4115333113 ...
##
  $ first_intercourse
                                          : int 15 14 17 16 21 23 17 26 20 15 ...
   $ pregnancies
                                          : int 1114426352...
##
                                          : logi FALSE FALSE TRUE FALSE FALSE ...
##
  $ smokes
##
   $ smoking_time
                                          : num
                                                 0 0 0 37 0 ...
   $ smoke_rate
                                          : num
                                                0 0 0 37 0 0 3.4 0 0 2.8 ...
##
                                          : int 0001100100...
   $ hormomal contraceptives
##
   $ hormonal contraceptives time
                                          : num 00031500200...
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
##
   $ iud
  $ iud_time
                                          : num 0000007700 ...
##
   $ std
##
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
##
  $ std time
                                          : int 0000000000...
##
  $ condylomatosis
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
## $ cervical condylomatosis
                                          : int 0000000000...
## $ vaginal_condylomatosis
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
## $ vulvo_perineal_condylomatosis
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
##
  $ syphilis
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
## $ pelvic_inflammatory_disease
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
##
  $ genital herpes
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
  $ molluscum_contagiosm
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
  $ aids
##
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
##
   $ hiv
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
##
   $ hepatitis_b
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
##
   $ hpv
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
  $ diagnosis num
                                          : int 0000000000...
##
## $ first_diagnosis_time
                                          : int 0000000000...
## $ last_diagnosis_time
                                          : int 0000000000...
  $ dx cancer
                                          : logi FALSE FALSE FALSE TRUE FALSE FALSE ...
  $ dx cin
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
##
##
   $ dx hpv
                                          : logi FALSE FALSE FALSE TRUE FALSE FALSE ...
##
  $ dx
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
##
   $ hinselmann
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
   $ schiller
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
##
##
  $ cytology
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
##
  $ biopsy
                                          : logi FALSE FALSE FALSE FALSE FALSE ...
  $ rz transform age
                                          : num -1.133 -2.058 0.868 2.429 2.083 ...
## $ rz_transform_sexual_partners
                                                 1.15 -1.173 -1.173 1.606 0.505 ...
                                          : num
                                          : num -0.745 -1.358 0.141 -0.27 1.49 ...
## $ rz_transform_first_intercourse
## $ rz transform pregnancies
                                          : num -0.929 -0.929 -0.929 1.19 1.19 ...
## $ rz transform smoking time
                                          : num -0.18 -0.18 -0.18 3.04 -0.18 ...
## $ rz_transform_smoke_rate
                                          : num -0.18 -0.18 -0.18 3.04 -0.18 ...
## $ rz_transform_hormonal_contraceptives_time: num -0.772 -0.772 -0.772 0.76 2.123 ...
## $ rz transform iud
                                         : num -0.121 -0.121 -0.121 -0.121 -0.121 ...
## $ rz transform std
                                         : num -0.116 -0.116 -0.116 -0.116 ...
## $ rz_transform_diagnosis_num
                                          : num -0.104 -0.104 -0.104 -0.104 ...
## $ rz_transform_first_diagnosis_time
                                          : num -0.104 -0.104 -0.104 -0.104 ...
## $ rz transform last diagnosis time
                                          : num -0.104 -0.104 -0.104 -0.104 ...
```

```
dim(cervicalCA)
```

```
## [1] 858 49
```

class(cervicalCA)	
## [1] "data.frame"	
glimpse(cervicalCA)	

```
## Rows: 858
## Columns: 49
## $ X
                                                 <int> 1, 2, 3, 4, 5, 6, 7, 8, 9, 1~
                                                 <int> 18, 15, 34, 52, 46, 42, 51, ~
## $ age
## $ sexual_partners
                                                 <int> 4, 1, 1, 5, 3, 3, 3, 1, 1, 3~
## $ first intercourse
                                                 <int> 15, 14, 17, 16, 21, 23, 17, ~
## $ pregnancies
                                                 <int> 1, 1, 1, 4, 4, 2, 6, 3, 5, 2~
## $ smokes
                                                 <lg>\lambda FALSE, FALSE, TRUE, F~
## $ smoking_time
                                                 <dbl> 0.000, 0.000, 0.000, 37.000,~
## $ smoke rate
                                                 <dbl> 0.0, 0.0, 0.0, 37.0, 0.0, 0.~
## $ hormomal contraceptives
                                                 <int> 0, 0, 0, 1, 1, 0, 0, 1, 0, 0~
## $ hormonal_contraceptives_time
                                                 <dbl> 0.00, 0.00, 0.00, 3.00, 15.0~
## $ iud
                                                 <lg>\lambda FALSE, FALSE, FALSE, \simeq
## $ iud time
                                                 <dbl> 0, 0, 0, 0, 0, 0, 7, 7, 0, 0~
## $ std
                                                 <lg>\lambda false, False, False, \( \simeg \)
                                                 <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ std_time
## $ condylomatosis
                                                 <lg>\lambda false, False, False, \( \simeg \)
## $ cervical condylomatosis
                                                 <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ vaginal_condylomatosis
                                                 <lg>\text{lgl} FALSE, FALSE, FALSE, \times
## $ vulvo_perineal_condylomatosis
                                                 <lg>\text{lgl} FALSE, FALSE, FALSE, \times
## $ syphilis
                                                 <lg>\lambda false, False, False, \( \simeg \)
## $ pelvic inflammatory disease
                                                 <lg>\lambda false, False, False, \( \simeg \)
## $ genital_herpes
                                                 <lg>\text{lgl} FALSE, FALSE, FALSE, \times
                                                 <lg>\lambda FALSE, FALSE, FALSE, \simeq
## $ molluscum contagiosm
## $ aids
                                                 <lg> FALSE, FALSE, FALSE, ~
## $ hiv
                                                 <lg>\lambda false, False, False, \( \simeg \)
                                                 <lg>lg FALSE, FALSE, FALSE, ~
## $ hepatitis_b
## $ hpv
                                                 <lg>\lambda FALSE, FALSE, FALSE, \simeq
## $ diagnosis num
                                                 <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ first diagnosis time
                                                 <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ last diagnosis time
                                                 <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0~
## $ dx cancer
                                                 false, False, False, TRUE, F~
## $ dx cin
                                                 <lg>ly FALSE, FALSE, FALSE, ~
## $ dx hpv
                                                 <lg>\lambda FALSE, FALSE, TRUE, F~
                                                 <lg>\lambda false, False, False, \( \simeg \)
## $ dx
## $ hinselmann
                                                 <lg>\lambda false, False, False, \( \simeg \)
## $ schiller
                                                 <lg>ly FALSE, FALSE, FALSE, ~
## $ cytology
                                                 <lg>\text{lgl} FALSE, FALSE, FALSE, \times
## $ biopsy
                                                 false, false, false, false, ~
## $ rz transform age
                                                 <dbl> -1.13285321, -2.05809611, 0.~
                                                 <dbl> 1.1496428, -1.1725461, -1.17~
## $ rz_transform_sexual_partners
## $ rz transform first intercourse
                                                 <dbl> -0.7448795, -1.3575023, 0.14~
                                                 <dbl> -0.9292959, -0.9292959, -0.9~
## $ rz transform pregnancies
                                                 <dbl> -0.1804361, -0.1804361, -0.1~
## $ rz_transform_smoking_time
## $ rz transform smoke rate
                                                 <dbl> -0.1804361, -0.1804361, -0.1~
## $ rz_transform_hormonal_contraceptives_time <dbl> -0.77211458, -0.77211458, -0~
## $ rz transform iud
                                                 <dbl> -0.1213977, -0.1213977, -0.1~
## $ rz transform std
                                                 <dbl> -0.1155205, -0.1155205, -0.1~
## $ rz transform diagnosis num
                                                 <dbl> -0.1037777, -0.1037777, -0.1~
## $ rz transform first diagnosis time
                                                 <dbl> -0.1037777, -0.1037777, -0.1~
                                                 <dbl> -0.1037777, -0.1037777, -0.1~
## $ rz transform last diagnosis time
```

```
head(cervicalCA)
```

```
X age sexual_partners first_intercourse pregnancies smokes smoking_time
                                           15
                                                           FALSE
## 2 2
       15
                          1
                                           14
                                                         1 FALSE
                                                                             0
## 3 3
                         1
                                           17
                                                           FALSE
                                                                             0
       34
                                                         1
                          5
## 4 4
       52
                                           16
                                                         4
                                                            TRUE
                                                                            37
                          3
## 5 5
       46
                                           21
                                                         4
                                                           FALSE
                                                                             0
## 6 6 42
                          3
                                           23
                                                         2 FALSE
                                                                             0
##
     smoke_rate hormomal_contraceptives hormonal_contraceptives_time
                                                                         iud
## 1
              0
                                       0
                                                                     0 FALSE
## 2
              0
                                       0
                                                                     0 FALSE
              0
                                       0
                                                                     0 FALSE
## 3
                                       1
## 4
             37
                                                                     3 FALSE
## 5
              0
                                       1
                                                                    15 FALSE
## 6
                                       0
                                                                     0 FALSE
                std std time condylomatosis cervical condylomatosis
                           0
                                       FALSE
## 1
            0 FALSE
## 2
            0 FALSE
                            0
                                       FALSE
                                                                    0
## 3
            0 FALSE
                            0
                                       FALSE
                                                                    0
            0 FALSE
                                                                    0
## 4
                            0
                                       FALSE
## 5
            0 FALSE
                           0
                                                                    a
                                       FALSE
## 6
            0 FALSE
                           0
                                       FALSE
     vaginal_condylomatosis vulvo_perineal_condylomatosis syphilis
##
                      FALSE
## 1
                                                     FALSE
                                                               FALSE
## 2
                      FALSE
                                                     FALSE
                                                               FALSE
## 3
                      FALSE
                                                     FALSE
                                                               FALSE
## 4
                      FALSE
                                                     FALSE
                                                               FALSE
## 5
                      FALSE
                                                     FALSE
                                                               FALSE
## 6
                      FALSE
                                                     FALSE
                                                               FALSE
##
     pelvic_inflammatory_disease genital_herpes molluscum_contagiosm aids
                            FALSE
## 1
                                           FALSE
                                                                 FALSE FALSE FALSE
## 2
                            FALSE
                                           FALSE
                                                                 FALSE FALSE FALSE
## 3
                            FALSE
                                                                 FALSE FALSE FALSE
                                           FALSE
## 4
                            FALSE
                                           FALSE
                                                                 FALSE FALSE FALSE
## 5
                            FALSE
                                           FALSE
                                                                 FALSE FALSE FALSE
## 6
                            FALSE
                                           FALSE
                                                                 FALSE FALSE FALSE
                   hpv diagnosis_num first_diagnosis_time last_diagnosis_time
##
     hepatitis b
## 1
           FALSE FALSE
                                    0
## 2
           FALSE FALSE
                                    0
                                                          0
                                                                              0
## 3
           FALSE FALSE
                                    0
                                                          0
                                                                              0
## 4
           FALSE FALSE
                                    a
                                                          0
                                                                              0
## 5
           FALSE FALSE
                                    0
                                                          0
                                                                              0
           FALSE FALSE
                                                          0
## 6
##
     dx cancer dx cin dx hpv
                                 dx hinselmann schiller cytology biopsy
## 1
         FALSE FALSE FALSE
                                         FALSE
                                                  FALSE
                                                           FALSE FALSE
## 2
                                                            FALSE FALSE
         FALSE FALSE FALSE
                                         FALSE
                                                  FALSE
## 3
         FALSE FALSE FALSE
                                         FALSE
                                                  FALSE
                                                            FALSE FALSE
## 4
          TRUE FALSE
                        TRUE FALSE
                                         FALSE
                                                  FALSE
                                                            FALSE FALSE
## 5
         FALSE FALSE FALSE
                                         FALSE
                                                  FALSE
                                                            FALSE FALSE
## 6
         FALSE FALSE FALSE
                                         FALSE
                                                  FALSE
                                                            FALSE FALSE
##
     rz_transform_age rz_transform_sexual_partners rz_transform_first_intercourse
## 1
           -1.1328532
                                           1.149643
                                                                         -0.7448795
## 2
           -2.0580961
                                          -1.172546
                                                                         -1.3575023
                                          -1.172546
## 3
            0.8681143
                                                                          0.1405289
## 4
            2.4291594
                                           1,606039
                                                                         -0.2702582
## 5
            2.0829847
                                           0.505078
                                                                          1.4900736
                                           0.505078
## 6
            1.7097570
                                                                          1.7421048
     rz_transform_pregnancies rz_transform_smoking_time rz_transform_smoke_rate
```

```
## 1
                    -0.9292959
                                               -0.1804361
                                                                        -0.1804361
## 2
                    -0.9292959
                                               -0.1804361
                                                                        -0.1804361
## 3
                   -0.9292959
                                               -0.1804361
                                                                        -0.1804361
## 4
                                                3.0448080
                                                                         3.0448080
                    1.1901358
## 5
                    1.1901358
                                               -0.1804361
                                                                        -0.1804361
## 6
                    0.0145909
                                               -0.1804361
                                                                        -0.1804361
     rz_transform_hormonal_contraceptives_time rz_transform_iud rz_transform_std
##
## 1
                                     -0.7721146
                                                       -0.1213977
                                                                         -0.1155205
## 2
                                     -0.7721146
                                                       -0.1213977
                                                                         -0.1155205
## 3
                                      -0.7721146
                                                       -0.1213977
                                                                         -0.1155205
## 4
                                       0.7603734
                                                       -0.1213977
                                                                         -0.1155205
## 5
                                       2.1229244
                                                       -0.1213977
                                                                         -0.1155205
## 6
                                                                         -0.1155205
                                     -0.7721146
                                                       -0.1213977
##
     rz_transform_diagnosis_num rz_transform_first_diagnosis_time
## 1
                      -0.1037777
                                                          -0.1037777
## 2
                      -0.1037777
                                                         -0.1037777
## 3
                      -0.1037777
                                                         -0.1037777
## 4
                      -0.1037777
                                                         -0.1037777
## 5
                      -0.1037777
                                                         -0.1037777
## 6
                      -0.1037777
                                                         -0.1037777
##
     rz_transform_last_diagnosis_time
## 1
                            -0.1037777
## 2
                            -0.1037777
## 3
                            -0.1037777
## 4
                            -0.1037777
## 5
                            -0.1037777
## 6
                            -0.1037777
```

tail(cervicalCA)

```
##
        X age sexual_partners first_intercourse pregnancies smokes smoking_time
## 853 853
                                               17
                                                            3 FALSE
                             3
## 854 854
                                                            0 FALSE
                                                                                0
            34
                                               18
## 855 855
            32
                             2
                                               19
                                                                                0
                                                            1
                                                              FALSE
                             2
## 856 856
           25
                                               17
                                                            0
                                                              FALSE
                                                                                0
                             2
## 857 857
            33
                                               24
                                                               FALSE
                                                                                0
                             2
## 858 858
           29
                                               20
                                                            1 FALSE
                                                                                 0
##
       smoke_rate hormomal_contraceptives hormonal_contraceptives_time
## 853
                                        1
                                                                   5.00 FALSE
## 854
                0
                                        0
                                                                   0.00 FALSE
## 855
                0
                                                                   8.00 FALSE
                                        1
                0
## 856
                                        1
                                                                   0.08 FALSE
## 857
                0
                                                                   0.08 FALSE
                                        1
## 858
                                                                   0.50 FALSE
                                        1
##
                  std std time condylomatosis cervical condylomatosis
              0 FALSE
## 853
                             0
                                        FALSE
## 854
              0 FALSE
                             0
                                        FALSE
                                                                     0
## 855
              0 FALSE
                             0
                                        FALSE
              0 FALSE
## 856
                             0
                                        FALSE
                                                                     0
                             0
## 857
              0 FALSE
                                        FALSE
## 858
              0 FALSE
                             0
                                        FALSE
       vaginal_condylomatosis vulvo_perineal_condylomatosis syphilis
##
                        FALSE
                                                       FALSE
## 853
                                                                FALSE
                        FALSE
                                                       FALSE
                                                                FALSE
## 854
## 855
                        FALSE
                                                       FALSE
                                                                FALSE
## 856
                        FALSE
                                                       FALSE
                                                                FALSE
## 857
                        FALSE
                                                       FALSE
                                                                FALSE
## 858
                        FALSE
                                                       FALSE
                                                                FALSE
##
       pelvic_inflammatory_disease genital_herpes molluscum_contagiosm aids
## 853
                             FALSE
                                            FALSE
                                                                  FALSE FALSE
## 854
                             FALSE
                                            FALSE
                                                                  FALSE FALSE FALSE
## 855
                                                                  FALSE FALSE FALSE
                             FALSE
                                            FALSE
## 856
                             FALSE
                                            FALSE
                                                                  FALSE FALSE FALSE
## 857
                             FALSE
                                            FALSE
                                                                  FALSE FALSE FALSE
## 858
                             FALSE
                                            FALSE
                                                                  FALSE FALSE FALSE
                     hpv diagnosis_num first_diagnosis_time last_diagnosis_time
##
       hepatitis b
## 853
             FALSE FALSE
                                     0
## 854
             FALSE FALSE
                                     0
                                                           0
                                                                               0
## 855
             FALSE FALSE
                                     0
                                                           0
                                                                               0
## 856
             FALSE FALSE
                                                           a
                                                                               0
## 857
                                                           0
             FALSE FALSE
                                                                               0
## 858
             FALSE FALSE
##
       dx cancer dx cin dx hpv
                                  dx hinselmann schiller cytology biopsy
## 853
           FALSE FALSE FALSE
                                          FALSE
                                                    FALSE
                                                             FALSE FALSE
## 854
           FALSE FALSE FALSE
                                          FALSE
                                                    FALSE
                                                             FALSE FALSE
## 855
           FALSE FALSE FALSE
                                          FALSE
                                                    FALSE
                                                             FALSE FALSE
## 856
           FALSE FALSE FALSE
                                          FALSE
                                                    FALSE
                                                              TRUE FALSE
## 857
           FALSE FALSE FALSE
                                          FALSE
                                                    FALSE
                                                             FALSE FALSE
## 858
           FALSE FALSE FALSE
                                          FALSE
                                                    FALSE
                                                             FALSE FALSE
       rz_transform_age rz_transform_sexual_partners
##
## 853
             1.78349821
                                           0.5050780
## 854
             0.86811427
                                           0.5050780
## 855
             0.67540588
                                           -0.2566631
## 856
            -0.04816689
                                           -0.2566631
## 857
             0.76232294
                                           -0.2566631
## 858
             0.38108094
                                           -0.2566631
##
       rz_transform_first_intercourse rz_transform_pregnancies
```

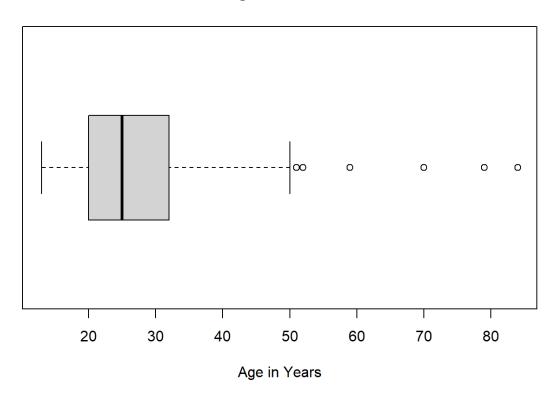
```
## 853
                             0.1405289
                                                        0.7031605
## 854
                             0.6055411
                                                       -2.3302971
## 855
                             1.0037832
                                                       -0.9292959
## 856
                             0.1405289
                                                       -2.3302971
## 857
                             1.8519853
                                                        0.0145909
## 858
                             1.2742887
                                                       -0.9292959
##
       rz_transform_smoking_time rz_transform_smoke_rate
                       -0.1804361
                                                 -0.1804361
## 853
## 854
                       -0.1804361
                                                 -0.1804361
## 855
                       -0.1804361
                                                 -0.1804361
## 856
                       -0.1804361
                                                 -0.1804361
                       -0.1804361
## 857
                                                 -0.1804361
## 858
                       -0.1804361
                                                 -0.1804361
##
       rz_transform_hormonal_contraceptives_time rz_transform_iud rz_transform_std
## 853
                                         1.0232917
                                                          -0.1213977
                                                                            -0.1155205
## 854
                                        -0.7721146
                                                          -0.1213977
                                                                            -0.1155205
## 855
                                         1.4812755
                                                          -0.1213977
                                                                            -0.1155205
## 856
                                        -0.1155205
                                                          -0.1213977
                                                                            -0.1155205
## 857
                                        -0.1155205
                                                          -0.1213977
                                                                            -0.1155205
## 858
                                                                            -0.1155205
                                         0.1804361
                                                          -0.1213977
##
       rz_transform_diagnosis_num rz_transform_first_diagnosis_time
## 853
                        -0.1037777
                                                            -0.1037777
                                                            -0.1037777
## 854
                        -0.1037777
## 855
                        -0.1037777
                                                            -0.1037777
## 856
                        -0.1037777
                                                            -0.1037777
## 857
                        -0.1037777
                                                            -0.1037777
## 858
                        -0.1037777
                                                            -0.1037777
##
       rz_transform_last_diagnosis_time
## 853
                              -0.1037777
## 854
                              -0.1037777
## 855
                               -0.1037777
## 856
                               -0.1037777
## 857
                               -0.1037777
## 858
                               -0.1037777
```

Data Analysis: Box Plots

I create a few box plots to analyze the measures of spread for a few variables. I chose to work with age, sexual partners, first intercourse, and pregnancies. These variables are numerical, as opposed to most of the other variables in the data set that are Boolean. Age is important because it gives the data scientist an idea of the ages associated with cervical cancer symptoms and risks. By analyzing the number of sexual partners, doctors can assess the importance of sexual partners as a risk factor for cervical cancer and other similar diseases. First intercourse data gives doctors an idea of how early on women are exposed to HPV. This gives them a time frame to work with when planning prevention. Pregnancy data helps data scientists further analyze the spread of HPV. Knowing the rate of perinatal transmission, data scientists can further examine the spread of this disease as it persists in our population.

```
#
# Basic boxplots
boxplot(cervicalCA$age, horizontal = TRUE, main = "Age Box Plot", xlab = "Age in Years")
```

Age Box Plot

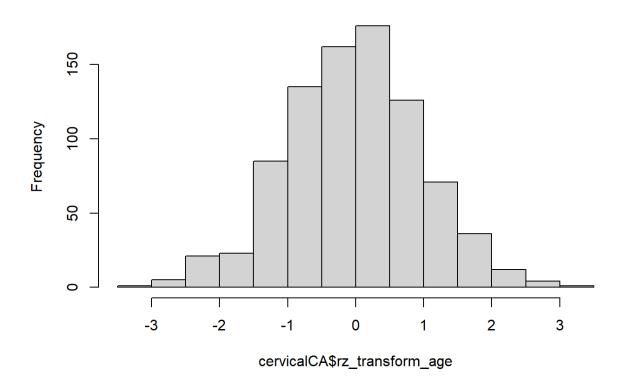


quantile(cervicalCA\$age)

0% 25% 50% 75% 100% ## 13 20 25 32 84

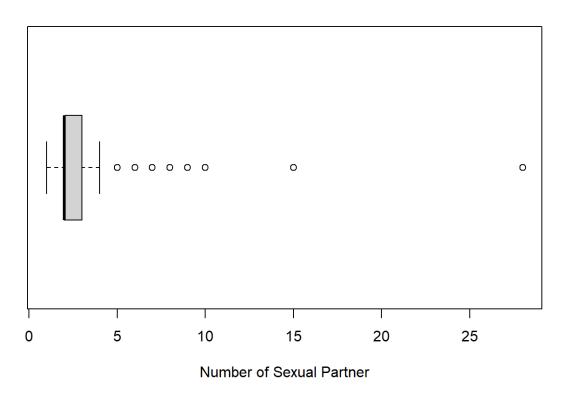
hist(cervicalCA\$rz_transform_age)

Histogram of cervicalCA\$rz_transform_age



```
# This is included because it tells us that most of
# the women that were studied were relatively young
# with some older women as outliers.
#
boxplot(cervicalCA$sexual_partners, horizontal = TRUE, main = "Sexual Partners Box Plot", xlab = "Number of Sexual Partner")
```

Sexual Partners Box Plot

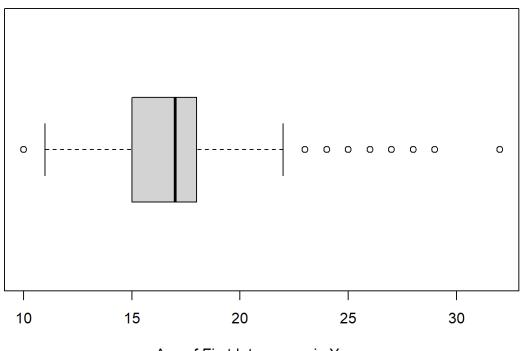


quantile(cervicalCA\$sexual_partners)

```
## 0% 25% 50% 75% 100%
## 1 2 2 3 28
```

```
#
# This boxplot is included because it tells us that
# most of the women had a few sexual partners, with a
# few outliers with many sexual partners. Since the
# main cause of Cervical cancer is HPV (an STD), it
# only makes sense that more sexual partners increases
# the likelihood of transmission.
#
boxplot(cervicalCA$first_intercourse, horizontal = TRUE, main = "First Intercourse Box Plot", xlab = "Age of First Intercourse in Years")
```

First Intercourse Box Plot



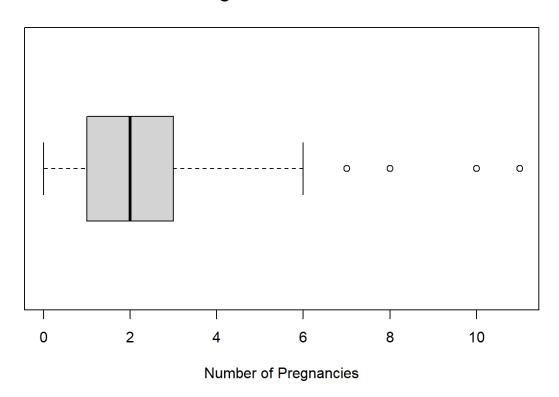
Age of First Intercourse in Years

quantile(cervicalCA\$first_intercourse)

```
## 0% 25% 50% 75% 100%
## 10 15 17 18 32
```

```
#
# This box plot is included because it tells us that
# most women in this dataset became sexually active
# relatively early (shortly after puberty),
# exposing them to stds early on in their lives.
#
boxplot(cervicalCA$pregnancies, horizontal = TRUE, main = "Pregnancies Box Plot", xlab = "Number of Pregnancies")
```

Pregnancies Box Plot



```
quantile(cervicalCA$pregnancies)
```

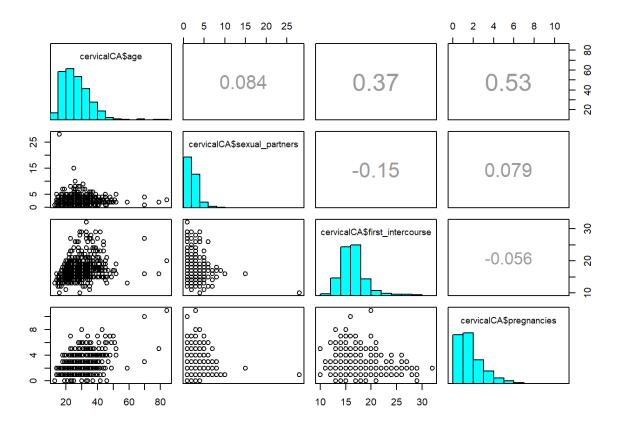
```
## 0% 25% 50% 75% 100%
## 0 1 2 3 11
```

```
#
# This box plot is included because it gives us an
# idea of the perinatal spread of HPV
```

Pairwise Correlation Plot

The pairwise correlation plot gives a brief overview of possible correlation between different variables. Here I look at age, sexual partners, first intercourse, and pregnancies to see if I can extrapolate any correlative relationships.

```
#
# Pairwise correlation plot
pairs(~cervicalCA$age + cervicalCA$sexual_partners + cervicalCA$first_intercourse + cervicalCA$pregnanci
es, upper.panel = panel.cor, diag.panel = panel.hist)
```



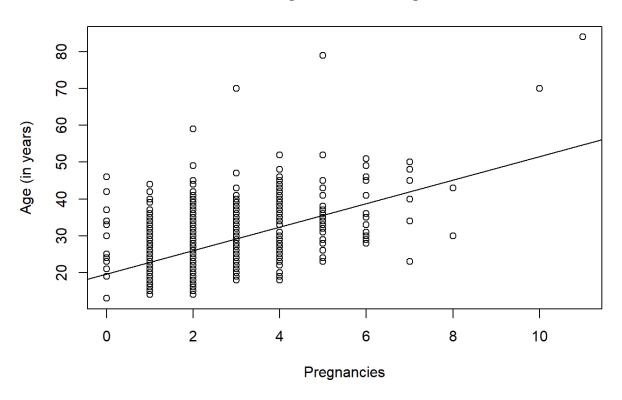
```
#
# This plot shows possible correlation between the
# variables age, sexual partners, first intercourse,
# and pregnancies. The correlation coefficients
# a moderate positive linear relationship between age
# and pregnancies. The coefficients also suggest a
# weak positive linear relationship between age and
# first sexual intercourse. The other coefficients
# don't show defensible relationships.
```

Linear Regression

Here I perform a linear regression of age and pregnancies. Based on the plot, pregnancies tend to increase with age, showing that many women may be passing HPV to their children. Also, the fact that mostly HPV can stay dormant for years supports the fact that women may unknowingly spread the disease to their children.

```
#
# Linear regression of age and pregnancies
plot(cervicalCA$age~cervicalCA$pregnancies,
    main="Pregnancies vs. Age",
    xlab="Pregnancies", ylab="Age (in years)")
fitline <- lm(cervicalCA$age~cervicalCA$pregnancies)
abline(fitline)</pre>
```

Pregnancies vs. Age



```
summary(fitline)
```

```
##
## Call:
## lm(formula = cervicalCA$age ~ cervicalCA$pregnancies)
  Residuals:
##
##
       Min
                1Q Median
                                 3Q
                                        Max
##
   -18.948
           -4.999
                    -1.474
                             4.001
                                    43.431
##
## Coefficients:
##
                          Estimate Std. Error t value Pr(>|t|)
   (Intercept)
                                                 41.88
                                                         <2e-16 ***
##
                           19.6191
                                        0.4684
   cervicalCA$pregnancies
                            3.1899
                                        0.1763
                                                 18.09
                                                         <2e-16 ***
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 7.232 on 856 degrees of freedom
## Multiple R-squared: 0.2766, Adjusted R-squared: 0.2757
## F-statistic: 327.2 on 1 and 856 DF, p-value: < 2.2e-16
```

Bayesian Information Criterion (BIC) Analysis

BIC analysis allows me to determine causation between any variables. I use it here to check for causation between age and hormonal contraceptives time. I first measure the BIC score of the target to itself, then measure it against age. If the second score is 10 less than the first score, than there is likely to be a causal relationship between the two variables. Here I determine that age likely causes people to use hormonal contraceptives for a longer time.

```
#
# BIC modeling for age -> hormonal contraceptives time
BIC(lm(cervicalCA$hormonal_contraceptives_time~1)) # 4644
```

```
## [1] 4644.483
```

```
BIC(lm(cervicalCA$hormonal_contraceptives_time~cervicalCA$age)) # 4570
```

```
## [1] 4570.944
```

```
# Causal
```

Separating Data

Here I separate the data based on a low number of sexual partners to examine patterns within just this group of people. I compare the BIC scores of condylomatosis and the diagnosis number and determine that it is causal. I then compare the BIC scores of HIV and the diagnosis number. Though this relationship is causal, it isn't as strong as the previous model because the BIC score difference is less. This makes sense because condylomatosis is much easier to diagnose than HIV, especially among people with low sexual parters (knowing that having low sexual partners decreases the risk of STD transmission).

```
#
# Separating based on a low number of sexual partners
lowSexualPartners <- filter(cervicalCA, sexual_partners <= median(cervicalCA$sexual_partners))
#
# BIC modeling for condylomatosis -> diagnosis num for those
# with low sexual partners
BIC(lm(lowSexualPartners$diagnosis_num~1)) # 248
```

```
## [1] 247.9661
```

BIC(lm(lowSexualPartners\$diagnosis_num~lowSexualPartners\$condylomatosis)) # -149

```
## [1] -149.4535
```

```
# Causal
#
# BIC modeling for hiv -> diagnosis num for those
# with low sexual partners
BIC(lm(lowSexualPartners$diagnosis_num~1)) # 248
```

```
## [1] 247.9661
```

```
BIC(lm(lowSexualPartners$diagnosis_num~lowSexualPartners$hiv)) # 32
```

```
## [1] 31.88176
```

```
#
# Causal, but less than condylomatosis which hints at
# less recognition of hiv than condylomatosis. This
# makes sense because the group of people have less
# sexual partners, making diagnosis less common.
```

More Separating Data

Here I separate the data based on whether the person has an STD. Again, I do this to analyze patters within this subset of people. Here I'm analyzing the causal relationship between HPV and a change in cancer. Based on the decrease BIC score difference, I determined that there is a strong causal relationship between these two variables. This makes sense since almost all of those who have cervical cancer developed their cancer from an HPV infection.

```
#
# Separating based on having an std
peopleWithSTDs <- filter(cervicalCA, std == TRUE)
#
# BIC modeling for hpv -> dx_cancer
# for people with stds
BIC(lm(peopleWithSTDs$dx_cancer~1)) # -59
```

```
## [1] -59.52232
```

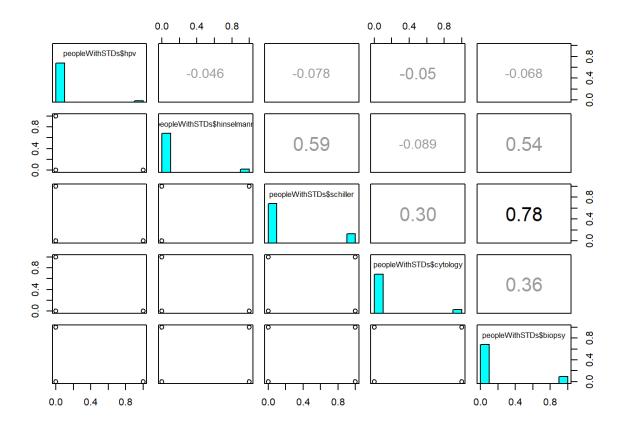
```
BIC(lm(peopleWithSTDs$dx_cancer~peopleWithSTDs$hpv)) # -5638
```

```
## [1] -5637.787
```

```
# Causal
```

To assess the danger of detecting HPV I made this pairwise plot to measure the correlation between HPV and the labs done to detect cervical cancer. This plot shows that HPV is generally not correlated with the cervical cancer tests, making it difficult for doctors to detect HPV when trying to diagnose cervical cancer.

```
#
# Pairwise plot of test results from people with stds with hpv.
pairs(~peopleWithSTDs$hpv + peopleWithSTDs$hinselmann + peopleWithSTDs$schiller + peopleWithSTDs$cytolog
y + peopleWithSTDs$biopsy, upper.panel = panel.cor, diag.panel = panel.hist)
```



```
# This shows that hpv generally goes unnoticed by these tests.
# Also the tests are correlated with each other (with the
# exception of cytology and hinselmann).
```

To further prove a lack of correlation between HPV and the cervical cancer tests, I designed a multiple linear model which produces a P value. This P value is used to assess the potential for a correlative relationship. The calculated P value was 0.97 which further proves that the tests were not statistically significant enough to support a correlative relationship

```
# Multifit of the tests based on hpv
multifit <- lm(peopleWithSTDs$hpv ~ peopleWithSTDs$hinselmann + peopleWithSTDs$schiller + peopleWithSTDs
$cytology + peopleWithSTDs$biopsy)
summary (multifit)</pre>
```

```
##
## Call:
## lm(formula = peopleWithSTDs$hpv ~ peopleWithSTDs$hinselmann +
       peopleWithSTDs$schiller + peopleWithSTDs$cytology + peopleWithSTDs$biopsy)
##
##
##
  Residuals:
##
       Min
                 10
                      Median
                                   30
                                           Max
## -0.03212 -0.03212 -0.03212 -0.02209 0.96788
##
## Coefficients:
##
                                 Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                                                0.121
                                 0.032123 0.020498
                                                       1.567
## peopleWithSTDs$hinselmannTRUE -0.007599 0.094165 -0.081
                                                                0.936
## peopleWithSTDs$schillerTRUE -0.022731 0.079989 -0.284
                                                                0.777
## peopleWithSTDs$cytologyTRUE
                                -0.017904 0.075019 -0.239
                                                                0.812
## peopleWithSTDs$biopsyTRUE
                                -0.002152 0.086551 -0.025
                                                                0.980
##
## Residual standard error: 0.1617 on 74 degrees of freedom
## Multiple R-squared: 0.006983,
                                   Adjusted R-squared:
## F-statistic: 0.1301 on 4 and 74 DF, p-value: 0.971
```

```
#
# The P value of 0.97 shows that the
# tests are not statistically significant enough
# to prove correlation.
#
# EOF (End of File)
```

Work Cited

"Basic Information about Cervical Cancer." Centers for Disease Control and Prevention, Centers for Disease Control and Prevention, 12 Jan. 2021, www.cdc.gov/cancer/cervical/basic info/index.htm.

"Cervical Biopsy." Johns Hopkins Medicine, John Hopkins Medicine, 2021, www.hopkinsmedicine.org/health/treatment-tests-and-therapies/cervical-biopsy.

"Cervical Cancer - Symptoms and Signs." Cancer.Net, 26 Feb. 2021, www.cancer.net/cancer-types/cervical-cancer/symptoms-and-signs.

"Cervical Cancer Statistics: Key Facts about Cervical Cancer." American Cancer Society, 2021, www.cancer.org/cancer/cervical-cancer/about/key-statistics.html.

"Cervical Cancer." Mayo Clinic, Mayo Foundation for Medical Education and Research, 17 June 2021, www.mayoclinic.org/diseases-conditions/cervical-cancer/symptoms-causes/syc-20352501.

Ih-Acr. "Patient Education Library." The Angeles Clinic, The Angeles Clinic, 2021, www.theangelesclinic.org/Home/ResearchClinicalTrials/PatientEducationLibrary/tabid/19283/ctl/View/mid/35200/Default.aspx? ContentPubID=30.