

Bootstrapping..

Load packages and data

```
suppressMessages(library(dplyr))
library(ggplot2)
library(moments)
library(haven)
library(tidyverse)
```

```
## -- Attaching core tidyverse packages ----- tidyverse 2.0.0 --
## v forcats 1.0.0      v stringr 1.5.1
## v lubridate 1.9.3    v tibble 3.2.1
## v purrr 1.0.2       v tidyr 1.3.1
## v readr 2.1.5
## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag() masks stats::lag()
## i Use the conflicted package (<http://conflicted.r-lib.org/>) to force all conflicts to become errors
```

```
library(boot)
```

```
data <- read.csv("ppha312x2021.csv") #working directory is same as data directory
# set seed to ensure same results
set.seed(110821)
```

```
data <- data %>% filter(inctot >= 0)
```

```
summary(data$age)
```

```
##      Length      Class      Mode
##      10140 character character
```

```
#desc(data$age)
```

```
#max(data$age)
```

```
summary(data)
```

```
##      year      statefip      met2013      perwt
## Min.   :2019   Length:10140   Length:10140   Min.    : 2.0
## 1st Qu.:2019   Class :character   Class :character   1st Qu.: 57.0
## Median :2019   Mode  :character   Mode  :character   Median  : 85.0
## Mean   :2019                      Mean   : 115.6
```

```
## 3rd Qu.:2019                                3rd Qu.: 133.0
## Max. :2019                                Max. :1977.0
## sex age race hispan
## Length:10140 Length:10140 Length:10140 Length:10140
## Class :character Class :character Class :character Class :character
## Mode :character Mode :character Mode :character Mode :character
##
##
##
## bpl educd empstat uhrswork
## Length:10140 Length:10140 Length:10140 Length:10140
## Class :character Class :character Class :character Class :character
## Mode :character Mode :character Mode :character Mode :character
##
##
##
## inctot incwage
## Min. : 0 Min. : 0
## 1st Qu.: 11775 1st Qu.: 0
## Median : 35000 Median : 25000
## Mean :1744935 Mean :209709
## 3rd Qu.: 94000 3rd Qu.: 88250
## Max. :9999999 Max. :999999
```

```
#New Column : African American
data %>% count(race)
```

```
## race n
## 1 American Indian or Alaska Native 9
## 2 Black/African American/Negro 3899
## 3 Chinese 9
## 4 Japanese 3
## 5 Other Asian or Pacific Islander 61
## 6 Other race, nec 93
## 7 Three or more major races 15
## 8 Two major races 136
## 9 White 5915
```

```
data$isAfricanAmerican <- ifelse(data$race == 'Black/African American/Negro', 1, 0)
data <- data %>% mutate(isAfricanAmerican = as.factor(isAfricanAmerican))
summary(data$isAfricanAmerican)
```

```
## 0 1
## 6241 3899
```

```
head(data$isAfricanAmerican)
```

```
## [1] 1 0 0 0 1 1
## Levels: 0 1
```

```
data$isFemale <- ifelse(data$sex == 'Female', 1, 0)
data <- data %>% mutate(isFemale = as.factor(isFemale))
summary(data$isFemale)
```

```
##      0      1
## 4823 5317
```

```
summary(data)
```

```
##      year      statefip      met2013      perwt
## Min.   :2019   Length:10140   Length:10140   Min.    :  2.0
## 1st Qu.:2019   Class :character   Class :character 1st Qu.: 57.0
## Median :2019   Mode  :character   Mode  :character  Median : 85.0
## Mean   :2019                                     Mean   :115.6
## 3rd Qu.:2019                                     3rd Qu.:133.0
## Max.   :2019                                     Max.   :1977.0
##      sex      age      race      hispan
## Length:10140   Length:10140   Length:10140   Length:10140
## Class :character   Class :character   Class :character   Class :character
## Mode  :character   Mode  :character   Mode  :character   Mode  :character
##
##
##      bpl      educd      empstat      uhrswork
## Length:10140   Length:10140   Length:10140   Length:10140
## Class :character   Class :character   Class :character   Class :character
## Mode  :character   Mode  :character   Mode  :character   Mode  :character
##
##
##      inctot      incwage      isAfricanAmerican isFemale
## Min.   :      0   Min.   :      0   0:6241          0:4823
## 1st Qu.: 11775   1st Qu.:      0   1:3899          1:5317
## Median : 35000   Median : 25000
## Mean   :1744935   Mean   :209709
## 3rd Qu.: 94000   3rd Qu.: 88250
## Max.   :9999999   Max.   :999999
```

```
data <- data %>% mutate(isEmployed = ifelse(data$empstat == 'Employed', 1, 0))
data <- data %>% mutate(isEmployed = as.factor(isEmployed))
summary(data$isEmployed)
```

```
##      0      1
## 5478 4662
```

```
summary(data)
```

```
##      year      statefip      met2013      perwt
## Min.   :2019   Length:10140   Length:10140   Min.    :  2.0
## 1st Qu.:2019   Class :character   Class :character 1st Qu.: 57.0
## Median :2019   Mode  :character   Mode  :character  Median : 85.0
```

```
## Mean :2019 Mean : 115.6
## 3rd Qu.:2019 3rd Qu.: 133.0
## Max. :2019 Max. :1977.0
## sex age race hispan
## Length:10140 Length:10140 Length:10140 Length:10140
## Class :character Class :character Class :character Class :character
## Mode :character Mode :character Mode :character Mode :character
##
##
##
## bpl educd empstat uhrswork
## Length:10140 Length:10140 Length:10140 Length:10140
## Class :character Class :character Class :character Class :character
## Mode :character Mode :character Mode :character Mode :character
##
##
##
## inctot incwage isAfricanAmerican isFemale isEmployed
## Min. : 0 Min. : 0 0:6241 0:4823 0:5478
## 1st Qu.: 11775 1st Qu.: 0 1:3899 1:5317 1:4662
## Median : 35000 Median : 25000
## Mean :1744935 Mean :209709
## 3rd Qu.: 94000 3rd Qu.: 88250
## Max. :9999999 Max. :999999
```

```
#formatting age to be numeric using as.numeric
data <- data %>% mutate(age = as.numeric(age))
```

```
## Warning: There was 1 warning in 'mutate()'.
## i In argument: 'age = as.numeric(age)'.
## Caused by warning:
## ! NAs introduced by coercion
```

```
data_1 <- data %>%
  filter(isFemale == '1' & isAfricanAmerican == '1' & isEmployed == '1') %>%
  # select(incwage, age)

data_1 <- data_1[, c("incwage", "age")]

summary(data_1)
```

```
## incwage age
## Min. : 0 Min. :16.00
## 1st Qu.: 15000 1st Qu.:33.00
## Median : 29000 Median :44.00
## Mean : 33869 Mean :44.21
## 3rd Qu.: 46000 3rd Qu.:56.00
## Max. :476000 Max. :86.00
```

```
print(colnames(data_1))
```

```
## [1] "incwage" "age"
```

```
corr <- function(x, indices){
  data <- x[indices, ]
  corr <- cor(data[,1], data[,2])
  return( corr )
}
```

```
coefficient <- boot(data_1[,
                      corr,
                      10000)
```

```
coefficient
```

```
##
## ORDINARY NONPARAMETRIC BOOTSTRAP
##
##
## Call:
## boot(data = data_1[, statistic = corr, R = 10000)
##
##
## Bootstrap Statistics :
##      original      bias    std. error
## t1* 0.1497379 0.0008852872 0.02755512
```

#The standard error of the correlation coefficient between labor wages, worker ages is ~ 0.0278

#Filter white, men, employed

```
data_2 <- data %>% filter(data$race == "White" & data$isEmployed == '1' & data$isFemale == '0')
```

```
data_2 <- data_2[, c("incwage", "age")]
```

```
coefficient <- boot(data_2[,
                      corr,
                      10000)
```

```
coefficient
```

```
##
## ORDINARY NONPARAMETRIC BOOTSTRAP
##
##
## Call:
## boot(data = data_2[, statistic = corr, R = 10000)
##
##
## Bootstrap Statistics :
##      original      bias    std. error
## t1* 0.1748645 0.0004523001 0.02119825
```

#The standard error of the correlation coefficient between labor wages, worker ages is ~ 0.021