## P8130 Final Project

```
library(tidyverse)
## -- Attaching packages ------ tidyverse 1.3.1 --
## v ggplot2 3.3.5
                                                  v purrr
                                                                           0.3.4
## v tibble 3.1.6
                                                     v dplyr
                                                                           1.0.7
## v tidyr
                             1.1.4
                                                    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(pastecs)
##
## Attaching package: 'pastecs'
## The following objects are masked from 'package:dplyr':
##
##
                first, last
## The following object is masked from 'package:tidyr':
##
##
                extract
Read in dataset
cdi = read_csv("./cdi.csv") %>%
    janitor::clean_names()
## Rows: 440 Columns: 17
## -- Column specification -----
## Delimiter: ","
## chr (2): cty, state
## dbl (15): id, area, pop, pop18, pop65, docs, beds, crimes, hsgrad, bagrad, p...
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
cdi
## # A tibble: 440 x 17
                                                                                pop pop18 pop65 docs beds crimes hsgrad bagrad
##
                    id cty
                                              state area
##
                                              <chr> <dbl> <
              <dbl> <chr>
## 1
                                                              4060 8.86e6 32.1
                                                                                                           9.7 23677 27700 688936
                                                                                                                                                                                      22.3
                     1 Los_An~ CA
                      2 Cook
                                                                                                                                                                                      22.8
## 2
                                             IL
                                                               946 5.11e6 29.2 12.4 15153 21550 436936
                                                                                                                                                                     73.4
                      3 Harris TX
                                                             1729 2.82e6 31.3
                                                                                                          7.1 7553 12449 253526
                                                                                                                                                                     74.9
                                                                                                                                                                                      25.4
                      4 San_Di~ CA
                                                             4205 2.50e6 33.5 10.9 5905 6179 173821
                                                                                                                                                                                      25.3
                                                                                                                                                                     81.9
```

```
27.8
## 5
         5 Orange CA
                          790 2.41e6 32.6
                                            9.2 6062
                                                       6369 144524
## 6
                           71 2.30e6 28.3 12.4
                                                 4861
                                                       8942 680966
                                                                     63.7
                                                                            16.6
         6 Kings
                   NY
##
  7
         7 Marico~ AZ
                          9204 2.12e6 29.2 12.5
                                                 4320
                                                       6104 177593
                                                                     81.5
                                                                            22.1
                          614 2.11e6 27.4 12.5
## 8
         8 Wayne MI
                                                 3823
                                                       9490 193978
                                                                     70
                                                                            13.7
## 9
         9 Dade
                   FL
                          1945 1.94e6
                                      27.1 13.9
                                                 6274
                                                       8840 244725
                                                                     65
                                                                            18.8
## 10
        10 Dallas TX
                          880 1.85e6 32.6
                                             8.2 4718 6934 214258
                                                                     77.1
                                                                            26.3
\#\# # ... with 430 more rows, and 5 more variables: poverty <dbl>, unemp <dbl>,
      pcincome <dbl>, totalinc <dbl>, region <dbl>
## no missing value
cdi %>%
 select(everything()) %>%
 summarise_all(funs(sum(is.na(.))))
## Warning: `funs()` was deprecated in dplyr 0.8.0.
## Please use a list of either functions or lambdas:
##
##
    # Simple named list:
##
    list(mean = mean, median = median)
##
##
    # Auto named with `tibble::lst()`:
    tibble::1st(mean, median)
##
##
##
    # Using lambdas
    list(~ mean(., trim = .2), ~ median(., na.rm = TRUE))
## This warning is displayed once every 8 hours.
## Call `lifecycle::last_lifecycle_warnings()` to see where this warning was generated.
## # A tibble: 1 x 17
           cty state area pop pop18 pop65 docs beds crimes hsgrad bagrad
    0
                               Ω
                                     0
                                           0
                                                 0
                                                      0
## # ... with 5 more variables: poverty <int>, unemp <int>, pcincome <int>,
    totalinc <int>, region <int>
Data cleaning
cdi =
 cdi %>%
 mutate(crm 1000 = crimes/pop*1000, # as indicated by the project prompt
        docs_rate_1000 = docs/pop*1000, # every 1000 people how many doctors
        beds docs = beds/docs)
cdi
## # A tibble: 440 x 20
##
                   state area
                                 pop pop18 pop65 docs beds crimes hsgrad bagrad
##
     <dbl> <chr>
                   <chr> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
                                                                    <dbl> <dbl>
##
   1
         1 Los_An~ CA
                          4060 8.86e6 32.1
                                             9.7 23677 27700 688936
                                                                     70
                                                                            22.3
##
  2
         2 Cook
                           946 5.11e6 29.2 12.4 15153 21550 436936
                                                                     73.4
                                                                            22.8
                   IL
##
  3
         3 Harris TX
                          1729 2.82e6
                                     31.3
                                                 7553 12449 253526
                                                                     74.9
                                             7.1
         4 San_Di~ CA
                          4205 2.50e6 33.5
                                           10.9
                                                  5905
                                                                            25.3
##
  4
                                                       6179 173821
                                                                     81.9
## 5
         5 Orange CA
                          790 2.41e6
                                      32.6
                                             9.2
                                                  6062
                                                       6369 144524
                                                                     81.2
                                                                            27.8
## 6
                           71 2.30e6 28.3
                                           12.4
                                                  4861
                                                       8942 680966
                                                                     63.7
                                                                            16.6
         6 Kings
                   NY
## 7
         7 Marico~ AZ
                         9204 2.12e6 29.2 12.5
                                                  4320
                                                       6104 177593
                                                                     81.5
                                                                            22.1
## 8
                          614 2.11e6 27.4 12.5
                                                 3823
                                                       9490 193978
                                                                     70
         8 Wayne
                   MΙ
                                                                            13.7
```

```
## 9  9 Dade FL  1945 1.94e6 27.1 13.9 6274 8840 244725 65 18.8
## 10  10 Dallas TX  880 1.85e6 32.6 8.2 4718 6934 214258 77.1 26.3
## # ... with 430 more rows, and 8 more variables: poverty <dbl>, unemp <dbl>,
## # pcincome <dbl>, totalinc <dbl>, region <dbl>, crm_1000 <dbl>,
## # docs_rate_1000 <dbl>, beds_docs <dbl>
```

## **Data Exploration**

```
## summary statistics
knitr::kable(summary(cdi))
```

```
id
                            state area pop pop1&pop65locs beds crimeksgraddagraphovertynempcinctontalinegionerm d1000 brade d1000
: :
                                                                         :16.40
                                                                                                   : : :
                                                                                                                                                 :46.60
                                                                                                                                                                        : : : :
1.0
                                            15.0 100043
                                                                                       3.00039.092.0563
                                                                                                                                                               8.10\ 1.400\, 2.200\, 8899\, 1141
                                                                                                                                                                                                                                                   4.601\ 0.3559
1st \quad Class \ Class \ 1st \quad 
Qu.:140ar-:char-Qu.: Qu.: Qu.:2020 Qu.: Qu.: Qu.: Qu.: Qu.:70881028 Qu.: Qu.:16018 Qu.:2000 Qu.: Qu.:1.34565
                                            451.2139027
                                                                                      9.875182.8\,390.8\,6220
                                                                                                                                                                             5.3005.100
                            ac-
                                                                                                                                                                                                                       2311
                                                                                                                                                                                                                                                   38.102.2127
             ac-
             ter
                            ter
:220.5char-:char-:
                                                                         :28.1011.750
                                                                                                                : :
                                                                                                                                                 :77.7019.70
                                                                                                                                                                                       :
                                                                                                                                                                                                   :17759
                                                                                                                                                                                                                                     :3.000
                            ac-
                                            656.5\,217280
                                                                                                     401.0\,755.0\,11820
                                                                                                                                                                             7.9006.200
                                                                                                                                                                                                                       3857
                                                                                                                                                                                                                                                   52.429.7509
             ac-
             ter
                                        MeanNA NA
:220.5
                                                                         :28.57.12.17:0
                                                                                                                                                 :77.5621.08
                                                                                                                                                                                           :
                                                                                                                                                                                                         :18561
                                                                                                                                                                                                                                     :2.461:
                                                                                                                                                                             8.7216.597
                                            1041.493011
                                                                                                      988.0\,1458.\mathbf{@}7112
                                                                                                                                                                                                                       7869
                                                                                                                                                                                                                                                   57.28@.1230
3rd NA NA
                                            Qu.:330.2
                                            946.8436064
                                                                                                      1036.0575.26280
                                                                                                                                                                                           7.500
                                                                                                                                                                                                                       8654
                                                                                                                                                                                                                                                   72.5972.4915
:200628863164.7033.8023677277006889362.9052.3036.3021.3067544184234.000295.987.0376741667
:440.0
```

```
cdi
## # A tibble: 440 x 20
         id ctv
                    state
                            area
                                    pop pop18 pop65 docs beds crimes hsgrad bagrad
                                  <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>
      <dbl> <chr>
                                                                          <dbl>
                                                                                 <dbl>
##
                    <chr> <dbl>
                            4060 8.86e6
                                         32.1
                                                9.7 23677 27700 688936
                                                                                  22.3
##
    1
          1 Los An~ CA
##
    2
          2 Cook
                             946 5.11e6
                                         29.2
                                               12.4 15153 21550 436936
                                                                           73.4
                                                                                  22.8
                    IL
##
    3
          3 Harris TX
                            1729 2.82e6
                                         31.3
                                                7.1
                                                      7553 12449 253526
                                                                           74.9
                                                                                  25.4
          4 San_Di~ CA
                            4205 2.50e6
                                         33.5
                                               10.9
                                                      5905
                                                            6179 173821
                                                                           81.9
                                                                                  25.3
##
    4
##
    5
          5 Orange
                    CA
                             790 2.41e6
                                         32.6
                                                9.2
                                                      6062
                                                            6369 144524
                                                                           81.2
                                                                                  27.8
##
    6
          6 Kings
                    NY
                              71 2.30e6
                                         28.3
                                               12.4
                                                      4861
                                                            8942 680966
                                                                           63.7
                                                                                  16.6
##
    7
          7 Marico~ AZ
                            9204 2.12e6
                                         29.2
                                               12.5
                                                      4320
                                                            6104 177593
                                                                           81.5
                                                                                  22.1
##
    8
          8 Wayne
                    MI
                             614 2.11e6
                                         27.4
                                               12.5
                                                      3823
                                                            9490 193978
                                                                           70
                                                                                  13.7
##
    9
          9 Dade
                    FL
                            1945 1.94e6
                                         27.1
                                               13.9
                                                      6274
                                                            8840 244725
                                                                           65
                                                                                  18.8
         10 Dallas TX
                            880 1.85e6 32.6
                                                8.2 4718 6934 214258
                                                                                  26.3
## # ... with 430 more rows, and 8 more variables: poverty <dbl>, unemp <dbl>,
       pcincome <dbl>, totalinc <dbl>, region <dbl>, crm 1000 <dbl>,
## #
       docs_rate_1000 <dbl>, beds_docs <dbl>
```