# Coding Session: Data Wrangling 1

## Environmental Data Analytics | Rachel Gonsenhauser

Spring 2020

## Setup

#### Changing column headings for clean dataset join later

```
#Changing column headings
colnames (Arsenic)
    [1] "stateFIPS"
                                        "State"
                                       "County"
##
    [3] "countyFIPS"
##
       "Year"
                                        "Value"
        "Data.Comment"
##
    [7]
                                        "Maximum.Contaminant.Level"
    [9] "PWS.ID"
                                        "CWS.Name"
## [11] "Population.Served"
                                        "Maximum.Contaminant.Level.1"
head(Arsenic)
##
     stateFIPS
                 State countyFIPS County Year Value Data.Comment
## 1
                              4001 Apache 2006
                                                 6.00
             4 Arizona
                                                                 NA
## 2
             4 Arizona
                              4001 Apache 2006
                                                 2.00
                                                                 NA
## 3
                              4001 Apache 2007
                                                 1.50
                                                                 NA
             4 Arizona
             4 Arizona
                              4001 Apache 2007
                                                 4.41
                                                                 NA
## 5
             4 Arizona
                              4001 Apache 2007
                                                 1.50
                                                                 NA
## 6
             4 Arizona
                              4001 Apache 2007
##
         Maximum.Contaminant.Level
                                       PWS.ID
                                                                           CWS.Name
## 1 Less than or Equal to MCL (2) AZ0401018
                                                               LIVCO WATER COMPANY
## 2 Less than or Equal to MCL (2) AZO401047 LORD AZ WATER 2 - WINCHESTER TRAILS
## 3
                  Not Detected (3) AZ0401001
                                                                        ALPINE DWID
## 4 Less than or Equal to MCL (2) AZ0401004
                                                                      EAGAR TOWN OF
                  Not Detected (3) AZ0401039
                                                           OJO BONITO ESTATES DWID
## 6
                  Not Detected (3) AZ0401010
                                                           PINECREST WATER COMPANY
##
     Population.Served
                                                  Maximum.Contaminant.Level.1
## 1
                   745 Maximum Contaminant Level: Less than or Equal to MCL
## 2
                   366 Maximum Contaminant Level: Less than or Equal to MCL
                   582
                                     Maximum Contaminant Level: Not Detected
## 3
## 4
                  5000 Maximum Contaminant Level: Less than or Equal to MCL
## 5
                    53
                                     Maximum Contaminant Level: Not Detected
## 6
                    73
                                     Maximum Contaminant Level: Not Detected
summary(Arsenic)
##
      stateFIPS
                             State
                                            countyFIPS
                                                                    County
##
           : 4.0
   Min.
                   California
                                :20353
                                         Min.
                                                 : 4001
                                                          Washington
                                                                          1983
   1st Qu.:12.0
                   New York
                                :13014
                                         1st Qu.:12083
                                                          Los Angeles :
                                                                          1955
  Median:29.0
                   Pennsylvania:13010
                                         Median :29133
                                                          Jefferson
                                                                          1807
```

```
Mean
          :28.6
                  Florida
                             :12249
                                       Mean
                                              :28658
                                                       Marion
                                                                  : 1734
##
   3rd Qu.:42.0
                  Washington :11518
                                       3rd Qu.:42019
                                                                  : 1716
                                                       Orange
   Max. :55.0
                  Missouri
                           : 9180
##
                                       Max. :55141
                                                       Hillsborough: 1679
##
                  (Other)
                              :83935
                                                       (Other)
                                                                  :152385
##
        Year
                      Value
                                  Data.Comment
##
          :1999
                                  Mode:logical
   Min.
                  0.50 :31557
   1st Qu.:2004
                 1.00 :23465
                                  NA's:163259
   Median:2009
                  2.50 :10740
##
##
   Mean :2009
                  0.01
                         : 8238
   3rd Qu.:2013
                  1.50
##
                        : 7927
  Max. :2018
                  0.70
                         : 6825
                  (Other):74507
##
                   Maximum.Contaminant.Level
##
                                                  PWS.ID
  Greater than MCL (1)
##
                             : 4914
                                             CA0110001:
                                                           20
  Less than or Equal to MCL (2): 49508
                                             CA0110005:
                                                           20
##
   Not Detected (3)
                                :108837
                                             CA0210001:
                                                           20
##
                                             CA0510004:
                                                           20
##
                                             CA0510006:
                                                           20
##
                                             CA0510017:
                                                           20
##
                                             (Other) :163139
##
                    CWS.Name
                                  Population.Served
   GREEN ACRES MHP
                      : 54
                                  Min.
   COUNTRYSIDE MHP
                             41 1st Qu.:
                                              109
##
                             40 Median:
## MOUNTAIN VIEW MHP
                                              473
                        :
                             39 Mean : 13635
## WHISPERING PINES MHP :
                             36 3rd Qu.:
  AUBURN WATER DISTRICT:
                                             3500
## CITY OF WESTMINSTER :
                             33 Max.
                                         :8271000
## (Other)
                        :163016
##
                                         Maximum.Contaminant.Level.1
## Maximum Contaminant Level: Greater than MCL
## Maximum Contaminant Level: Less than or Equal to MCL: 49508
##
   Maximum Contaminant Level: Not Detected
##
##
##
##
colnames(Arsenic)[6] <-c("Arsenic_ugL")</pre>
colnames(Arsenic)[8] <-c("MCL_Arsenic")</pre>
colnames(Arsenic)
   [1] "stateFIPS"
                                     "State"
   [3] "countyFIPS"
                                     "County"
##
  [5] "Year"
                                     "Arsenic_ugL"
## [7] "Data.Comment"
                                     "MCL_Arsenic"
## [9] "PWS.ID"
                                     "CWS.Name"
## [11] "Population.Served"
                                     "Maximum.Contaminant.Level.1"
colnames(Income)
## [1] "stateFIPS"
                     "State"
                                    "countyFIPS"
                                                   "County"
                                                                  "Year"
## [6] "Value"
                     "Data.Comment" "X"
head(Income)
    stateFIPS
                State countyFIPS County Year Value Data.Comment X
```

```
## 1
            1 Alabama
                             1001 Autauga 2000 42,463
                                                                NA NA
                                                                NA NA
             1 Alabama
                             1001 Autauga 2001 42,183
## 3
             1 Alabama
                             1001 Autauga 2002 42,841
                                                                NA NA
## 4
                             1001 Autauga 2003 44,241
             1 Alabama
                                                                NA NA
                             1001 Autauga 2004 45,379
## 5
             1 Alabama
                                                                NA NA
## 6
             1 Alabama
                             1001 Autauga 2005 45,019
                                                                NA NA
summary(Income)
                                                            County
##
      stateFIPS
                         State
                                       countyFIPS
                                     Min. : 1001
##
   Min. : 1.00
                    Texas : 4318
                                                     Washington: 527
   1st Qu.:18.00
                    Georgia: 2703
                                     1st Qu.:18179
                                                     Jefferson :
  Median :29.00
                    Virginia: 2275
                                     Median :29177
                                                     Franklin :
                                                                  425
## Mean
          :30.29
                    Kentucky: 2040
                                     Mean
                                            :30399
                                                     Jackson
                                                                  408
                    Missouri: 1955
   3rd Qu.:45.00
                                     3rd Qu.:45083
                                                     Lincoln
                                                                  408
##
   Max. :56.00
                    Kansas : 1785
                                            :56045
                                                     Madison
                                                                  340
                                     Max.
##
                    (Other) :38334
                                                      (Other)
                                                                :50860
##
         Year
                       Value
                                   Data.Comment
##
           :2000
                   No Data:
                                   Mode:logical
                                                  Mode:logical
   Min.
                              17
                   38,916 :
                              10
                                   NA's:53410
                                                  NA's:53410
   1st Qu.:2004
  Median:2008
                   37,120 :
## Mean
         :2008
                   38,407 :
                               9
   3rd Qu.:2012
                   39,219:
## Max. :2016
                   31,434 :
                   (Other):53348
colnames(Income)[6] <-c("MHI")</pre>
colnames (PFAS)
  [1] "stateFIPS"
##
                            "State"
                                                "countyFIPS"
   [4] "County"
                            "Year"
                                                "Value"
  [7] "Data.Comment"
                            "Status"
                                                "PWS.ID"
## [10] "CWS.Name"
                            "Population.Served" "Contaminant"
head(PFAS)
                 State countyFIPS County
                                               Year Value Data.Comment
##
     stateFIPS
## 1
             1 Alabama
                         1021 Chilton 2013-2015 20.0
## 2
             1 Alabama
                             1033 Colbert 2013-2015 50.0
                                                                    NΔ
## 3
             1 Alabama
                             1033 Colbert 2013-2015
                                                    60.0
## 4
             1 Alabama
                             1043 Cullman 2013-2015 180.0
## 5
             1 Alabama
                             1043 Cullman 2013-2015 90.0
## 6
                             1049 DeKalb 2013-2015 70.0
             1 Alabama
##
           Status
                     PWS.ID
                                                     CWS.Name Population.Served
## 1 Detected (2) AL0000213
                                     Clanton Water Department
                                                                           13500
## 2 Detected (2) AL0000314 Colbert County Rural Water System
                                                                           10731
## 3 Detected (2) AL0000314 Colbert County Rural Water System
                                                                           10731
## 4 Detected (2) AL0000413
                                       VAW Water System, Inc.
                                                                           29985
## 5 Detected (2) AL0000413
                                       VAW Water System, Inc.
                                                                           29985
## 6 Detected (2) AL0001422
                               Northeast Alabama Water System
                                                                           42609
##
     Contaminant
## 1
           PFOA
## 2
           PFOS
## 3
           PFOA
           PFOS
## 4
```

```
summary(PFAS)
                                         countyFIPS
     stateFIPS
                              State
                                                               County
##
   Min. : 1.00
                   California
                                 :35
                                       Min. : 1021
                                                       Orange
                                                                  : 13
##
   1st Qu.: 6.00
                   New Jersey
                                 :24
                                       1st Qu.: 6059
                                                       Los Angeles: 12
## Median :19.50
                                 :21
                   Alabama
                                       Median :19600
                                                       Bergen
## Mean :21.77
                   Florida
                                 :14
                                             :21828
                                                       Washington: 7
                                       Mean
## 3rd Qu.:36.00
                   North Carolina:11
                                       3rd Qu.:36071
                                                       Bucks
                                                       El Paso
## Max. :55.00
                  Pennsylvania :10
                                       Max. :55131
##
                   (Other)
                                 :83
                                                       (Other)
                                                                  :147
##
          Year
                                 Data.Comment
                       Value
                                                         Status
##
   2013-2015:198
                   40.0 : 10
                                 Mode:logical
                                                Detected (2):198
                         : 10
##
                                 NA's:198
                   50.0
##
                   20.0
##
                   43.0
##
                   21.0
##
                   30.0
                    (Other):153
##
##
         PWS.ID
                                     CWS.Name
                                                Population.Served Contaminant
##
   AL0000314: 2
                   Artesian Water Company: 2
                                                Min. :
                                                            129
                                                                  PFOA: 107
  AL0000413: 2
                   ATLANTIC CITY MUA
                                                1st Qu.: 19426
                                                                  PFOS: 91
                                      : 2
                   CALAM - SUBURBAN
## AL0000577: 2
                                         : 2
                                                Median : 32573
## AL0000588: 2
                   Chatsworth
                                         : 2
                                                      : 91716
                                                Mean
## AL0000591: 2
                   CITY OF ANAHEIM
                                         : 2
                                                3rd Qu.: 87450
                   CITY OF LATHROP
## AL0000783: 2
                                         : 2
                                                Max.
                                                       :2100000
## (Other) :186
                   (Other)
                                         :186
colnames(PFAS)[6] <-c("PFAS_ppt")</pre>
colnames(Trihalomethane)
   [1] "stateFIPS"
                                     "State"
  [3] "countyFIPS"
                                      "County"
## [5] "Year"
                                     "Value"
## [7] "Data.Comment"
                                     "Maximum.Contaminant.Level"
## [9] "PWS.ID"
                                     "CWS.Name"
## [11] "Population.Served"
                                     "Maximum.Contaminant.Level.1"
head(Trihalomethane)
    stateFIPS
                State countyFIPS County Year Value Data.Comment
## 1
            4 Arizona
                            4001 Apache 2006 0.25
## 2
                            4001 Apache 2006 18.00
            4 Arizona
                                                             NA
                            4001 Apache 2006 2.00
## 3
            4 Arizona
                                                             NA
## 4
                            4001 Apache 2007 16.50
                                                             NA
            4 Arizona
## 5
            4 Arizona
                            4001 Apache 2007 6.40
                                                             NA
## 6
                            4001 Apache 2007 3.80
            4 Arizona
                                                             NA
##
        Maximum.Contaminant.Level
                                     PWS.ID
                                                       CWS.Name Population.Served
## 1
                 Not Detected (3) AZ0401056
                                                    ASPC APACHE
                                                                              540
## 2 Less than or Equal to MCL (2) AZ0401004
                                                  EAGAR TOWN OF
                                                                             5000
## 3 Less than or Equal to MCL (2) AZ0401012
                                             ST JOHNS CITY OF
                                                                             3800
## 4 Less than or Equal to MCL (2) AZ0401004
                                                  EAGAR TOWN OF
                                                                             5000
## 5 Less than or Equal to MCL (2) AZO401018 LIVCO WATER COMPANY
                                                                              745
```

## 5

## 6

**PFOA** 

**PFOS** 

```
## 6 Less than or Equal to MCL (2) AZ0401012
                                             ST JOHNS CITY OF
                                                                             3800
##
                             Maximum.Contaminant.Level.1
## 1
                 Maximum Contaminant Level: Not Detected
## 2 Maximum Contaminant Level: Less than or Equal to MCL
## 3 Maximum Contaminant Level: Less than or Equal to MCL
## 4 Maximum Contaminant Level: Less than or Equal to MCL
## 5 Maximum Contaminant Level: Less than or Equal to MCL
## 6 Maximum Contaminant Level: Less than or Equal to MCL
summary(Trihalomethane)
##
     stateFIPS
                            State
                                           countyFIPS
                                                                  County
  Min. : 4.00 Florida
                              : 19237
                                         Min. : 4001
                                                                        2546
                                                         Polk
   1st Qu.:20.00
                   New York
                               : 17283
                                         1st Qu.:20061
                                                                        2345
                                                                    :
                                                         Washington
## Median: 29.00 Pennsylvania: 16832
                                         Median :29165
                                                         Marion
                                                                        2117
## Mean :30.17
                   Louisiana : 10334
                                         Mean
                                               :30235
                                                         Hillsborough:
                                                                        2093
   3rd Qu.:42.00 Missouri
                               : 9440
                                         3rd Qu.:42003
                                                         Jefferson
                                                                        1940
##
  Max. :55.00 Iowa
                               : 8896
                                         Max. :55141
                                                         Orange
                                                                        1638
##
                   (Other)
                               :105595
                                                         (Other)
                                                                     :174938
##
        Year
                      Value
                                   Data.Comment
                         : 6942
   Min.
          :1999
                  0.25
                                   Mode:logical
                         : 6002
   1st Qu.:2007
                  1.00
                                   NA's:187617
  Median:2012
                  2.00
                         : 3427
## Mean :2011
                  0.00
                         : 2969
                  2.50
   3rd Qu.:2015
                         : 2944
                         : 2774
  Max. :2018
                  0.01
##
##
                  (Other):162559
##
                   Maximum.Contaminant.Level
                                                   PWS.ID
                          : 5303
## Greater than MCL (1)
                                             C00101140:
## Less than or Equal to MCL (2):154064
                                             CO0138045:
                                                           20
  Not Detected (3)
                                : 28250
                                             FL1030050:
##
                                             FL1030515:
##
                                             FL1660596:
                                                           20
##
                                             FL2100741:
                                             (Other) :187497
##
                                     CWS.Name
                                                   Population.Served
##
   WHISPERING PINES MHP
                                              45
                                                   Min.
   GREEN ACRES MHP
                                                   1st Qu.:
                                              42
                                                               224
                                                   Median :
## MOUNTAIN VIEW MHP
                                              39
                                                               990
## SUEZ WATER
                                                   Mean : 11522
## FLORIDA GOVERNMENTAL UTILITY AUTHORITY:
                                                   3rd Qu.:
                                              35
                                                              4805
## RICHLAND, CITY OF
                                              35
                                                   Max.
##
  (Other)
                                         :187383
##
                                         Maximum.Contaminant.Level.1
## Maximum Contaminant Level: Greater than MCL
  Maximum Contaminant Level: Less than or Equal to MCL:154064
  Maximum Contaminant Level: Not Detected
##
##
##
colnames(Trihalomethane)[6] <-c("TTHM_ugL")</pre>
colnames(Trihalomethane)[8] <-c("MCL_TTHM")</pre>
```

```
colnames(Uranium)
    [1] "stateFIPS"
                                       "State"
    [3] "countyFIPS"
                                       "County"
   [5] "Year"
##
                                      "Value"
  [7] "Data.Comment"
                                       "Maximum.Contaminant.Level"
## [9] "PWS.ID"
                                       "CWS.Name"
## [11] "Population.Served"
                                      "Maximum.Contaminant.Level.1"
head(Uranium)
                 State countyFIPS County Year Value Data.Comment
     stateFIPS
                             4001 Apache 2007 5.50
             4 Arizona
## 2
                             4001 Apache 2008 3.70
             4 Arizona
                                                               NA
## 3
             4 Arizona
                             4001 Apache 2008 31.40
                                                               NA
                             4001 Apache 2010 0.50
## 4
                                                               NA
             4 Arizona
             4 Arizona
                             4001 Apache 2011 0.50
## 6
             4 Arizona
                             4001 Apache 2011 7.95
                                      PWS.ID
         Maximum.Contaminant.Level
                                                             CWS.Name
## 1 Less than or Equal to MCL (2) AZ0401013
                                               SPRINGERVILLE TOWN OF
## 2 Less than or Equal to MCL (2) AZ0401004
                                                        EAGAR TOWN OF
              Greater than MCL (1) AZ0401022 SANDERS SCHOOL DISTRICT
## 3
## 4
                  Not Detected (3) AZ0401013
                                               SPRINGERVILLE TOWN OF
## 5
                  Not Detected (3) AZ0401056
                                                          ASPC APACHE
## 6 Less than or Equal to MCL (2) AZ0401004
                                                        EAGAR TOWN OF
    Population.Served
                                                Maximum.Contaminant.Level.1
## 1
                  1972 Maximum Contaminant Level: Less than or Equal to MCL
## 2
                  5000 Maximum Contaminant Level: Less than or Equal to MCL
## 3
                                Maximum Contaminant Level: Greater than MCL
                   350
## 4
                  1972
                                    Maximum Contaminant Level: Not Detected
## 5
                   540
                                    Maximum Contaminant Level: Not Detected
                  5000 Maximum Contaminant Level: Less than or Equal to MCL
summary(Uranium)
      stateFIPS
##
                              State
                                            countyFIPS
                                                                      County
##
   Min.
          : 4.00
                    California
                                :14019
                                                : 4001
                                          Min.
                                                          Los Angeles
                                                                         : 1192
   1st Qu.: 6.00
                    Pennsylvania: 3645
                                          1st Qu.: 6083
                                                           Kern
                                                                         : 1152
  Median :20.00
                    New Hampshire: 2790
                                          Median :20055
                                                                            855
                                                           Rockingham
   Mean
         :22.06
                    Connecticut : 2461
                                          Mean
                                                 :22118
                                                           San Bernardino:
                                                                            732
##
   3rd Qu.:36.00
                    Oregon
                                 : 2187
                                          3rd Qu.:36071
                                                          Riverside
                                                                            678
##
   Max.
           :55.00
                    New Mexico
                                : 2150
                                                 :55141
                                                          Hillsborough :
                                          Max.
                                                                            654
##
                    (Other)
                                 :15124
                                                           (Other)
                                                                         :37113
##
         Year
                       Value
                                   Data.Comment
##
           :1999
   Min.
                   0.50
                          : 6009
                                   Mode:logical
   1st Qu.:2005
                   0.00
                          : 2673
                                   NA's:42376
  Median:2009
                   1.00
                          : 1796
##
   Mean
           :2009
                   0.75
                          : 1461
##
                   0.10
                          : 1087
   3rd Qu.:2013
##
   Max.
           :2018
                   2.00
                          : 747
##
                   (Other):28603
##
                   Maximum.Contaminant.Level
                                                    PWS.ID
## Greater than MCL (1)
                                 : 1241
                                              CA1910146:
                                                            20
```

:16171

CA1910163:

CA2000593:

20

## Less than or Equal to MCL (2):24964

## Not Detected (3)

```
##
                                             CA2010007:
                                                          20
##
                                             CA3310031:
                                                          20
##
                                             CA3600270:
                                                          20
##
                                             (Other) :42256
##
                                  CWS.Name
                                               Population.Served
## HILLCREST WATER DISTRICT
                                     :
                                          22
                                              Min.
## ALPINE WATER USERS ASSOCIATION
                                          20
                                              1st Qu.:
                                                            95
                                          20 Median:
## ARROWBEAR PARK CWD
                                                           300
                                               Mean : 16116
## CANAAN WATER DEPT
                                          20
## GOLDEN STATE WATER MORONGO DELNORTE:
                                          20
                                               3rd Qu.: 2800
## HILLVIEW WC-OAKHURST/SIERRA LAKES
                                          20 Max. :4072307
## (Other)
                                      :42254
                                         Maximum.Contaminant.Level.1
##
## Maximum Contaminant Level: Greater than MCL
## Maximum Contaminant Level: Less than or Equal to MCL:24964
##
   Maximum Contaminant Level: Not Detected
##
##
##
##
colnames(Uranium)[6] <-c("Uranium_ugL")</pre>
colnames(Uranium)[8] <-c("MCL_Uranium")</pre>
```

# Changing classes prior to joining datasets

```
# Changing classes of variables before joining
class(Arsenic$Year)
## [1] "integer"
Arsenic$Year <- as.numeric(Arsenic$Year)</pre>
class(Income$Year)
## [1] "integer"
Income$Year <- as.numeric(Income$Year)</pre>
class(PFAS$Year)
## [1] "factor"
# Dates for PFAS given as a range of 2013-2015, so I am changing them all to 2014 so I can integrate in
PFAS\$Year <- ((2013+2015)/2)
class(PFAS$Year)
## [1] "numeric"
class(Trihalomethane$Year)
## [1] "integer"
Trihalomethane$Year <- as.numeric(Trihalomethane$Year)</pre>
class(Uranium$Year)
## [1] "integer"
```

#### Joining and filtering data for processed dataset

```
# Joining datasets
Arsenic.Income <- left_join(Arsenic, Income)</pre>
## Joining, by = c("stateFIPS", "State", "countyFIPS", "County", "Year",
## "Data.Comment")
## Warning: Column `State` joining factors with different levels, coercing to
## character vector
## Warning: Column `County` joining factors with different levels, coercing to
## character vector
Arsenic.Income.PFAS <- left_join(Arsenic.Income, PFAS)</pre>
## Joining, by = c("stateFIPS", "State", "countyFIPS", "County", "Year",
## "Data.Comment", "PWS.ID", "CWS.Name", "Population.Served")
## Warning: Column `State` joining character vector and factor, coercing into
## character vector
## Warning: Column `County` joining character vector and factor, coercing into
## character vector
## Warning: Column `PWS.ID` joining factors with different levels, coercing to
## character vector
## Warning: Column `CWS.Name` joining factors with different levels, coercing to
## character vector
Arsenic.Income.PFAS.Trihalomethane <- left_join(Arsenic.Income.PFAS, Trihalomethane)
## Joining, by = c("stateFIPS", "State", "countyFIPS", "County",
## "Year", "Data.Comment", "PWS.ID", "CWS.Name", "Population.Served",
## "Maximum.Contaminant.Level.1")
## Warning: Column `State` joining character vector and factor, coercing into
## character vector
## Warning: Column `County` joining character vector and factor, coercing into
## character vector
## Warning: Column `PWS.ID` joining character vector and factor, coercing into
## character vector
## Warning: Column `CWS.Name` joining character vector and factor, coercing into
## character vector
Arsenic.Income.PFAS.Trihalomethane.Uranium <- left_join(Arsenic.Income.PFAS.Trihalomethane, Uranium)
## Joining, by = c("stateFIPS", "State", "countyFIPS", "County",
## "Year", "Data.Comment", "PWS.ID", "CWS.Name", "Population.Served",
## "Maximum.Contaminant.Level.1")
## Warning: Column `State` joining character vector and factor, coercing into
## character vector
## Warning: Column `County` joining character vector and factor, coercing into
```

```
## character vector
## Warning: Column `PWS.ID` joining character vector and factor, coercing into
## character vector
## Warning: Column `CWS.Name` joining character vector and factor, coercing into
## character vector
## Filtering dataset down to just necessary columns
Water.Quality.And.Income.Processed <-
    Arsenic.Income.PFAS.Trihalomethane.Uranium %>%
    select(stateFIPS:Arsenic_ugL, PWS.ID:Population.Served, MHI, PFAS_ppt, TTHM_ugL, Uranium_ugL, MCL_TTHM_
```

#### Changing MCL column data for clearer visualiation later

```
#Arsenic
levels(Water.Quality.And.Income.Processed$MCL_Arsenic) <- c(levels(Water.Quality.And.Income.Processed$M
Water.Quality.And.Income.Processed$MCL_Arsenic[Water.Quality.And.Income.Processed$MCL_Arsenic == 'Great
levels(Water.Quality.And.Income.Processed$MCL_Arsenic) <- c(levels(Water.Quality.And.Income.Processed$M
Water.Quality.And.Income.Processed$MCL Arsenic[Water.Quality.And.Income.Processed$MCL Arsenic == 'Less
levels(Water.Quality.And.Income.Processed$MCL_Arsenic) <- c(levels(Water.Quality.And.Income.Processed$M
Water.Quality.And.Income.Processed$MCL_Arsenic[Water.Quality.And.Income.Processed$MCL_Arsenic == 'Not D
#TTHM
levels(Water.Quality.And.Income.Processed$MCL_TTHM) <- c(levels(Water.Quality.And.Income.Processed$MCL_"</pre>
Water.Quality.And.Income.Processed$MCL_TTHM[Water.Quality.And.Income.Processed$MCL_TTHM == 'Greater than
levels(Water.Quality.And.Income.Processed$MCL_TTHM) <- c(levels(Water.Quality.And.Income.Processed$MCL_"</pre>
Water.Quality.And.Income.Processed $MCL_TTHM[Water.Quality.And.Income.Processed $MCL_TTHM == 'Less than o
levels(Water.Quality.And.Income.Processed$MCL_TTHM) <- c(levels(Water.Quality.And.Income.Processed$MCL_"</pre>
Water.Quality.And.Income.Processed $MCL_TTHM[Water.Quality.And.Income.Processed $MCL_TTHM == 'Not Detecte
levels(Water.Quality.And.Income.Processed$MCL_Uranium) <- c(levels(Water.Quality.And.Income.Processed$M</pre>
Water.Quality.And.Income.Processed$MCL Uranium[Water.Quality.And.Income.Processed$MCL Uranium == 'Great
levels(Water.Quality.And.Income.Processed$MCL Uranium) <- c(levels(Water.Quality.And.Income.Processed$M
Water.Quality.And.Income.Processed$MCL_Uranium[Water.Quality.And.Income.Processed$MCL_Uranium == 'Less
```

# Saving processed dataset for next session

write.csv(Water.Quality.And.Income.Processed, row.names = FALSE, file = "./Data/Processed/CDC\_WaterQual

levels(Water.Quality.And.Income.Processed\$MCL\_Uranium) <- c(levels(Water.Quality.And.Income.Processed\$MCL\_Uranium[Water.Quality.And.Income.Processed\$MCL\_Uranium[Water.Quality.And.Income.Processed\$MCL\_Uranium]</pre>