# Milestone #2

Team 20

9/25/2021

## Description of dataset

What is the data source? (1-2 sentences on where the data is coming from, dates included, etc.)

\*Our data are coming from the CalEnviroScreen 3.0 dataset, and a Mortality dataset from 2009-2018.

How does the dataset relate to the group problem statement and question?

\*Our data include statewide Particulate Matter (PM2.5) measurements on a zip code level. The mortality data include disease types, including Chronic Lower Respiratory Disease, which we will look to correlate between zip codes with critically high PM2.5 measurements and CLRD deaths in the years 2009-2018.

#### Import

\*Use appropriate import function and package based on the type of file

\*Utilize function arguments to control relevant components (i.e. change column types, column names, missing values, etc.)

\*Document the import process

```
air_qual <- read_csv("~/PHW251_Fall2021/Team Project/air_qual.csv")</pre>
##
## -- Column specification ------
##
     'California County' = col_character(),
    ZIP = col_double(),
    'Avg PM2.5 Per ZIP' = col_double()
##
## )
mort_by_zip <- read_csv("~/PHW251_Fall2021/Team Project/mort_by_zip.csv")</pre>
## Warning: Missing column names filled in: 'X1' [1]
##
## -- Column specification --------
## cols(
    X1 = col_double(),
##
## Year = col_double(),
##
    ZIP_Code = col_double(),
    Geography_Type = col_character(),
##
##
    Strata = col_character(),
##
    Strata_Name = col_character(),
##
    Cause = col_character(),
    Cause_Desc = col_character(),
##
##
    Count = col_double(),
##
    Annotation_Code = col_double(),
##
    Annotation_Desc = col_character()
## )
#change to snakecase
air_qual <- rename_with(air_qual, ~ tolower(gsub(" ","_",.x,fixed=TRUE)))
mort_by_zip <- rename_with(mort_by_zip, ~ tolower(gsub(" ","_",.x,fixed=TRUE)))</pre>
#remove column x1
mort_by_zip <- select(mort_by_zip, !x1)</pre>
#filter by CLD
mort_by_zip <- filter(mort_by_zip, cause=="CLD")</pre>
#keep rows from 2009-2018
mort_by_zip <- filter(mort_by_zip, between(year,2009,2018) )</pre>
```

#### Identify data types for 5+ data elements/columns/variables

\*Identify 5+ data elements required for your specified scenario. If <5 elements are required to complete the analysis, please choose additional variables of interest in the data set to explore in this milestone.

\*Utilize functions or resources in RStudio to determine the types of each data element (i.e. character, numeric, factor)

\*Identify the desired type/format for each variable—will you need to convert any columns to numeric or another type?

```
#5 data elements required
#mort_by_zip$cause
#mort_by_zip$year
\#mort\_by\_zip\$zip\_code
#air_qual$avg_pm2.5_per_zip
#air_qual$zip
#examine structure of dataset
str(mort_by_zip)
## tibble [26,640 x 10] (S3: tbl_df/tbl/data.frame)
## $ year
                    : num [1:26640] 2009 2009 2009 2009 2009 ...
                     : num [1:26640] 90001 90002 90003 90004 90005 ...
## $ zip_code
## $ geography_type : chr [1:26640] "Residence" "Residence" "Residence" "Residence" ...
## $ strata : chr [1:26640] "Total Population" "Total Population" "Total Population" "Total Population"
## $ strata_name : chr [1:26640] "Total Population" "Total Population" "Total Population" "Total Population"
## $ cause
                    : chr [1:26640] "CLD" "CLD" "CLD" "CLD" ...
## $ cause_desc : chr [1:26640] "Chronic lower respiratory diseases" "Chronic lower respiratory di
                   : num [1:26640] NA NA 18 NA NA NA NA 15 0 NA ...
## $ count
## $ annotation_code: num [1:26640] 1 1 NA 1 1 1 1 NA NA 1 ...
  $ annotation_desc: chr [1:26640] "Cell suppressed for small numbers" "Cell suppressed for small numbers"
str(air_qual)
## spec_tbl_df [1,377 x 3] (S3: spec_tbl_df/tbl_df/tbl/data.frame)
## $ california_county: chr [1:1377] "Alameda" "Alameda" "Alameda" "Alameda" ...
                       : num [1:1377] 94501 94502 94536 94538 94539 ...
## $ zip
## $ avg_pm2.5_per_zip: num [1:1377] 8.7 8.7 8.94 9.44 9.46 ...
##
  - attr(*, "spec")=
##
     .. cols(
         'California County' = col_character(),
##
##
         ZIP = col_double(),
##
        'Avg PM2.5 Per ZIP' = col_double()
##
     ..)
#number of rows and colums
nrow(air_qual)
## [1] 1377
ncol(air_qual)
## [1] 3
nrow(mort_by_zip)
## [1] 26640
```

```
ncol(mort_by_zip)
## [1] 10
#type/class of object
class(air_qual)
## [1] "spec_tbl_df" "tbl_df" "tbl" "data.frame"
typeof(air_qual)
## [1] "list"
class(mort_by_zip)
## [1] "tbl_df" "tbl" "data.frame"
typeof(mort_by_zip)
## [1] "list"
```

#### Provide a basic description of the 5+ data elements

Numeric: mean, median, range Character: unique values/categories \*Or any other descriptives that will be useful to the analysis

```
#summary - mean/median/quartiles
summary(mort_by_zip$cause)
##
      Length
                 Class
                             Mode
##
       26640 character character
summary(mort_by_zip$year)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                               Max.
                      2014
##
      2009
              2011
                                       2016
                                               2018
                               2014
summary(mort_by_zip$zip_code)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                               Max.
##
     90001
             92111
                     93534
                              93454
                                      95135
                                              96162
summary(air_qual$avg_pm2.5_per_zip)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                       NA's
                                               Max.
             7.860
                                    11.840
##
     1.651
                     9.536
                              9.781
                                             19.309
                                                           7
summary(air_qual$zip)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                               Max.
##
        32
             92040
                     93402
                              92832
                                      95110
                                              96161
#unique values
unique(mort_by_zip$cause)
## [1] "CLD"
unique(mort_by_zip$year)
    [1] 2009 2010 2011 2012 2013 2014 2015 2016 2017 2018
unique(mort_by_zip$zip_code)
##
      [1] 90001 90002 90003 90004 90005 90006 90007 90008 90009 90010 90011 90012
##
     [13] 90013 90014 90015 90016 90017 90018 90019 90020 90021 90022 90023 90024
##
     [25] 90025 90026 90027 90028 90029 90030 90031 90032 90033 90034 90035 90036
     [37] 90037 90038 90039 90040 90041 90042 90043 90044 90045 90046 90047 90048
##
     [49] 90049 90050 90051 90052 90053 90054 90055 90056 90057 90058 90059 90060
##
     [61] 90061 90062 90063 90064 90065 90066 90067 90068 90069 90070 90071 90072
##
##
     [73] 90073 90074 90075 90076 90077 90078 90079 90080 90081 90082 90083 90084
     [85] 90086 90087 90088 90089 90090 90091 90093 90094 90095 90096 90099 90101
##
##
     [97] 90102 90103 90189 90201 90202 90209 90210 90211 90212 90213 90220 90221
    [109] 90222 90223 90224 90230 90231 90232 90233 90239 90240 90241 90242 90245
##
    [121] 90247 90248 90249 90250 90251 90254 90255 90260 90261 90262 90263 90264
##
    [133] 90265 90266 90267 90270 90272 90274 90275 90277 90278 90280 90290 90291
##
##
    [145] 90292 90293 90294 90295 90296 90301 90302 90303 90304 90305 90306 90307
##
    [157] 90308 90309 90310 90311 90312 90313 90397 90398 90401 90402 90403 90404
    [169] 90405 90406 90407 90408 90409 90410 90411 90501 90502 90503 90504 90505
##
    [181] 90506 90507 90508 90509 90510 90601 90602 90603 90604 90605 90606 90607
##
    [193] 90608 90609 90610 90612 90620 90621 90622 90623 90624 90630 90631 90632
##
    [205] 90633 90637 90638 90639 90640 90650 90651 90652 90659 90660 90661 90662
```

```
[217] 90670 90671 90680 90701 90702 90703 90704 90706 90707 90710 90711 90712
##
    [229] 90713 90714 90715 90716 90717 90720 90721 90723 90731 90732 90733 90734
    [241] 90740 90742 90743 90744 90745 90746 90747 90748 90749 90755 90801 90802
    [253] 90803 90804 90805 90806 90807 90808 90809 90810 90813 90814 90815 90822
##
    [265] 90831 90832 90833 90834 90835 90840 90842 90844 90845 90846 90847 90848
    [277] 90853 90888 90895 90899 91001 91003 91006 91007 91008 91009 91010 91011
##
    [289] 91012 91016 91017 91020 91021 91023 91024 91025 91030 91031 91040 91041
    [301] 91042 91043 91046 91066 91077 91101 91102 91103 91104 91105 91106 91107
##
##
    [313] 91108 91109 91110 91114 91115 91116 91117 91118 91121 91123 91124 91125
    [325] 91126 91129 91131 91182 91184 91185 91188 91189 91191 91199 91201 91202
##
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##
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##
##
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##
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##
##
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##
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##
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##
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##
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##
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##
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##
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##
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##
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##
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##
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##
##
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##
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    [673] 92117 92118 92119 92120 92121 92122 92123 92124 92126 92127 92128 92129
##
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##
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    [709] 92161 92162 92163 92164 92165 92166 92167 92168 92169 92170 92171 92172
##
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    [733] 92191 92192 92193 92194 92195 92196 92197 92198 92199 92201 92202 92203
##
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    [757] 92234 92235 92236 92239 92240 92241 92242 92243 92244 92247 92248 92249
##
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##
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##
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##
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##
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##
##
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```

```
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##
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##
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##
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##
##
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##
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## [1501] 93926 93927 93928 93930 93932 93933 93940 93942 93943 93944 93950 93953
```

```
## [1513] 93954 93955 93960 93962 94002 94005 94010 94011 94013 94014 94015 94016
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## [1681] 94282 94283 94284 94285 94286 94287 94288 94289 94290 94291 94293 94294
## [1693] 94295 94296 94297 94298 94299 94301 94302 94303 94304 94305 94306 94309
## [1705] 94401 94402 94403 94404 94497 94501 94502 94503 94505 94506 94507 94508
## [1717] 94509 94510 94511 94512 94513 94514 94515 94516 94517 94518 94519 94520
## [1729] 94521 94522 94523 94524 94525 94526 94527 94528 94529 94530 94531 94533
## [1741] 94534 94535 94536 94537 94538 94539 94540 94541 94542 94543 94544 94545
## [1753] 94546 94547 94548 94549 94550 94551 94552 94553 94555 94556 94557 94558
## [1765] 94559 94560 94561 94562 94563 94564 94565 94566 94567 94568 94569 94570
## [1777] 94571 94572 94573 94574 94575 94576 94577 94578 94579 94580 94581 94582
## [1789] 94583 94585 94586 94587 94588 94589 94590 94591 94592 94595 94596 94597
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## [1813] 94611 94612 94613 94614 94615 94617 94618 94619 94620 94621 94622 94623
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