# Class 17: Vaccination Rate Mini Project

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# **Background**

```
"Statewide COVID-19 Vaccines Administered by ZIP Code"
```

```
url <- "covid19vaccinesbyzipcode_test.csv"</pre>
```

## **Getting Started**

```
# Import vaccination data
vax <- read.csv("covid19vaccinesbyzipcode_test.csv")
head(vax)</pre>
```

|   | as_of_date  | zip_code_ta | abulation_area lo | cal_heal | Lth_jur | isdiction | county          |
|---|-------------|-------------|-------------------|----------|---------|-----------|-----------------|
| 1 | 2021-01-05  |             | 92240             |          |         | Riverside | Riverside       |
| 2 | 2021-01-05  |             | 91302             |          | Lo      | s Angeles | Los Angeles     |
| 3 | 2021-01-05  |             | 93420             |          | San Lu  | is Obispo | San Luis Obispo |
| 4 | 2021-01-05  |             | 91901             |          |         | San Diego | San Diego       |
| 5 | 2021-01-05  |             | 94110             |          | San     | Francisco | San Francisco   |
| 6 | 2021-01-05  |             | 91902             |          |         | San Diego | San Diego       |
|   | vaccine_equ | ity_metric_ | _quartile         |          | vem_s   | ource     |                 |
| 1 |             |             | 1 Healthy         | Places   | Index   | Score     |                 |
| 2 |             |             | 4 Healthy         | Places   | Index   | Score     |                 |
| 3 |             |             | 3 Healthy         | Places   | Index   | Score     |                 |
| 4 |             |             | 3 Healthy         | Places   | Index   | Score     |                 |
| 5 |             |             | 4 Healthy         | Places   | Index   | Score     |                 |
| 6 |             |             | 4 Healthy         | Places   | Index   | Score     |                 |
|   | age12_plus_ | population  | age5_plus_populat | tion tot | _popul  | ation     |                 |
| 1 |             | 29270.5     | 33                | 3093     |         | 35278     |                 |

```
2
                 23163.9
                                          25899
                                                          26712
3
                 26694.9
                                          29253
                                                          30740
4
                 15549.8
                                          16905
                                                          18162
5
                 64350.7
                                          68320
                                                          72380
6
                 16620.7
                                          18026
                                                          18896
 persons_fully_vaccinated persons_partially_vaccinated
                          NA
2
                          15
                                                        614
3
                         NA
                                                         NA
4
                                                         NA
                          NA
5
                          17
                                                       1268
6
                          15
                                                        397
 percent_of_population_fully_vaccinated
                                         NA
1
2
                                  0.000562
3
                                         NA
4
                                         NA
5
                                  0.000235
6
                                  0.000794
 percent_of_population_partially_vaccinated
1
2
                                       0.022986
3
                                             NA
4
                                             NA
5
                                       0.017519
6
                                       0.021010
 percent_of_population_with_1_plus_dose booster_recip_count
1
                                         NA
                                                              NA
2
                                  0.023548
                                                              NA
3
                                         NA
                                                              NA
4
                                         NA
                                                              NΑ
5
                                  0.017754
                                                              NA
6
                                  0.021804
                                                              NA
 bivalent_dose_recip_count eligible_recipient_count
                                                       2
1
                           NA
2
                           NA
                                                      15
3
                           NA
                                                       4
4
                           NA
                                                       8
5
                           NA
                                                      17
6
                           NA
                                                      15
```

redacted

<sup>1</sup> Information redacted in accordance with CA state privacy requirements

<sup>2</sup> Information redacted in accordance with CA state privacy requirements

- 3 Information redacted in accordance with CA state privacy requirements
- 4 Information redacted in accordance with CA state privacy requirements
- 5 Information redacted in accordance with CA state privacy requirements
- 6 Information redacted in accordance with CA state privacy requirements

#### tail(vax)

| as_of_date zip_code_tabulat            | ion_area local  | _hea | lth_jurisdiction           |
|--|-----------------|------|----------------------------|
| 174631 2022-11-22                      | 94066           |      | San Mateo                  |
| 174632 2022-11-22                      | 92254           |      | Riverside                  |
| 174633 2022-11-22                      | 94065           |      | San Mateo                  |
| 174634 2022-11-22                      | 92280           |      | San Bernardino             |
| 174635 2022-11-22                      | 94929           |      | Marin                      |
| 174636 2022-11-22                      | 92313           |      | San Bernardino             |
| county vaccine_equi                    | ty_metric_quar  | tile | vem_source                 |
| 174631 San Mateo                       |                 | 4    | Healthy Places Index Score |
| 174632 Riverside                       |                 | 1    | Healthy Places Index Score |
| 174633 San Mateo                       |                 | 4    | Healthy Places Index Score |
| 174634 San Bernardino                  |                 | NA   | No VEM Assigned            |
| 174635 Marin                           |                 | 4    | CDPH-Derived ZCTA Score    |
| 174636 San Bernardino                  |                 | 2    | Healthy Places Index Score |
| age12_plus_population age5_            | plus_population | n to | t_population               |
| 174631 37730.3                         | 4090            | 3    | 43101                      |
| 174632 7882.3                          | 898             | 5    | 9779                       |
| 174633 10465.5                         | 1177            | 8    | 12461                      |
| 174634 0.0                             | (               | 0    | NA                         |
| 174635 174.2                           | 21              | 8    | 254                        |
| 174636 10842.9                         | 1184            |      | 12547                      |
| persons_fully_vaccinated pe            | rsons_partiall  | y_va | ccinated                   |
| 174631 38105                           |                 |      | 2889                       |
| 174632 9456                            |                 |      | 1688                       |
| 174633 11238                           |                 |      | 889                        |
| 174634 NA                              |                 |      | NA                         |
| 174635 NA                              |                 |      | NA                         |
| 174636 7948                            |                 |      | 600                        |
| <pre>percent_of_population_fully</pre> | _               |      |                            |
| 174631                                 | 0.884086        |      |                            |
| 174632                                 | 0.966970        |      |                            |
| 174633                                 | 0.901854        |      |                            |
| 174634                                 | NA              |      |                            |
| 174635                                 | NA              |      |                            |

| 174636 | 0.633458   |                     |
|--------|--|---------------------|
|        | <pre>percent_of_population_partially_vaccing</pre>   | ated                |
| 174631 | 0.06   | 7029                |
| 174632 | 0.172  | 2615                |
| 174633 | 0.07   | 1343                |
| 174634 |  | NA                  |
| 174635 |  | NA                  |
| 174636 | 0.04   | 7820                |
|        | ${\tt percent\_of\_population\_with\_1\_plus\_dose}$ | booster_recip_count |
| 174631 | 0.951115   | 27085               |
| 174632 | 1.000000   | 3840                |
| 174633 | 0.973197   | 8701                |
| 174634 | NA   | NA                  |
| 174635 | NA   | NA                  |
| 174636 | 0.681278   | 4522                |
|        | bivalent_dose_recip_count eligible_rec               | -                   |
| 174631 | 9127   | 37620               |
| 174632 | 372  | 9430                |
| 174633 | 3456   | 11021               |
| 174634 | NA   | 14                  |
| 174635 | NA   | 159                 |
| 174636 | 1085   | 7921                |
|        |  | redacted            |
| 174631 |  | No                  |
| 174632 |  | No                  |
| 174633 |  | No                  |
|        | Information redacted in accordance with              |                     |
|        | Information redacted in accordance with              |                     |
| 174636 |  | No                  |

Q1. What column details the total number of people fully vaccinated?

persons\_fully\_vaccinated details the total number of people fully vaccinated.

What column details the Zip code tabulation area?

zip\_code\_tabulation\_area details the Zip code tabulation area.

Q3. What is the earliest date in this dataset?

2021-01-05

Q4. What is the latest date in this dataset?

2022 - 11 - 22

skimr::skim(vax)

Table 1: Data summary

| Name                                     | vax     |
|--|---------|
| Number of rows                           | 174636  |
| Number of columns                        | 18      |
| Column type frequency: character numeric | 5<br>13 |
| Group variables                          | None    |

## Variable type: character

| skim_variable             | n_missing | $complete_{-}$ | _rate | min | max | empty | n_unique | whitespace |
|---------------------------|-----------|----------------|-------|-----|-----|-------|----------|------------|
| as_of_date                | 0         |                | 1     | 10  | 10  | 0     | 99       | 0          |
| local_health_jurisdiction | 0         |                | 1     | 0   | 15  | 495   | 62       | 0          |
| county                    | 0         |                | 1     | 0   | 15  | 495   | 59       | 0          |
| vem_source                | 0         |                | 1     | 15  | 26  | 0     | 3        | 0          |
| redacted                  | 0         |                | 1     | 2   | 69  | 0     | 2        | 0          |

## Variable type: numeric

| skim_variable            | n_mission              | <b>g</b> mplete       | nnaaa            | $\operatorname{sd}$ | p0     | p25    | p50      | p75      | p100     | hist |
|--------------------------|------------------------|-----------------------|------------------|---------------------|--------|--------|----------|----------|----------|------|
| zip_code_tabulation_a    | rea 0                  | 1.00                  | 93665.           | .111817.:           | 399000 | 192257 | .7933658 | .5905380 | .5997635 | .0   |
| vaccine_equity_metric_   | _ <b>&amp;6</b> 13tile | 0.95                  | 2.44             | 1.11                | 1      | 1.00   | 2.00     | 3.00     | 4.0      |      |
| age12_plus_population    | 0                      | 1.00                  | 18895.           | .0148993            | .880   | 1346.9 | 513685   | .1301756 | .1828556 | .7   |
| $age5\_plus\_population$ | 0                      | 1.00                  | 20875.           | .2241105            | .980   | 1460.5 | 5015364  | .0304877 | .0100190 | 2.0  |
| $tot\_population$        | 8514                   | 0.95                  | 23372.           | .7272628            | .512   | 2126.0 | 018714   | .038168  | .0101116 | 5.0  |
| persons_fully_vaccinate  | e <b>d</b> 4921        | 0.91                  | 13466.           | .3144722            | .461   | 883.00 | 8024.0   | 0022529  | .0807186 | .0   |
| persons_partially_vacci  | 14921                  | 0.91                  | 1707.5           | 601998.8            | 80 11  | 167.00 | 1194.0   | 02547.0  | 039204   | .0   |
| percent_of_population_   | _ <b>1f8666</b> 5_va   | c <b>cOn&amp;9</b> ec | 10.55            | 0.25                | 0      | 0.39   | 0.59     | 0.73     | 1.0      |      |
| percent_of_population_   | <b>_126665</b> ally    | _ <b>0a&amp;9</b> in  | 1a <b>0e01</b> 8 | 0.09                | 0      | 0.05   | 0.06     | 0.08     | 1.0      |      |
| percent_of_population_   | <b>1.9562</b> 1        | p <b>08</b> 9 d       | o <b>s</b> e61   | 0.25                | 0      | 0.46   | 0.65     | 0.79     | 1.0      |      |
| booster_recip_count      | 70421                  | 0.60                  | 5655.1           | 76867.4             | 4911   | 280.00 | 2575.0   | 009421.0 | 058304   | .0   |
| bivalent_dose_recip_co   | 0.016958               | 0.10                  | 1646.0           | 22161.8             | 84 11  | 109.00 | 719.00   | 2443.0   | 018109   | .0   |
| eligible_recipient_count | t 0                    | 1.00                  | 12309.           | .194555             | .830   | 466.00 | 5810.0   | 0021140  | .086696  | .0   |

Q5. How many numeric columns are in this dataset?

There are 13 numeric columns.

Q6. Note that there are "missing values" in the dataset. How many NA values there in the persons\_fully\_vaccinated column?

There are 15440 NA values in the persons\_fully\_vaccinated column.

```
sum( is.na(vax$persons_fully_vaccinated) )
[1] 14921
    What percent of persons_fully_vaccinated values are missing (to 2 significant figures)?
```

89 %

## Working with dates

```
library(lubridate)

Loading required package: timechange

Attaching package: 'lubridate'

The following objects are masked from 'package:base':
    date, intersect, setdiff, union

today()

[1] "2022-11-28"

# This will give an Error!
#today() - vax$as_of_date
```

```
# Specify that we are using the year-month-day format
  vax$as_of_date <- ymd(vax$as_of_date)

today() - vax$as_of_date[1]

Time difference of 692 days

vax$as_of_date[nrow(vax)] - vax$as_of_date[1]

Time difference of 686 days

Q9. How many days have passed since the last update of the dataset?</pre>
```

Q10. How many unique dates are in the dataset (i.e. how many different dates are

There are 98 unique dates.

detailed)?

6 days

## Working with ZIP codes

```
reverse_zipcode(c('92037', "92109") )
# A tibble: 2 x 24
 zipcode zipcode_~1 major~2 post_~3 common_c~4 county state lat
                                                                   lng timez~5
                            <chr>
                                        <bloom> <chr> <dbl> <dbl> <chr>
 <chr>
         <chr>
                    <chr>
1 92037
         Standard La Jol~ La Jol~ <raw 20 B> San D~ CA
                                                             32.8 -117. Pacific
2 92109
         Standard San Di~ San Di~ <raw 21 B> San D~ CA
                                                             32.8 -117. Pacific
# ... with 14 more variables: radius_in_miles <dbl>, area_code_list <blob>,
   population <int>, population_density <dbl>, land_area_in_sqmi <dbl>,
   water_area_in_sqmi <dbl>, housing_units <int>,
   occupied_housing_units <int>, median_home_value <int>,
   median_household_income <int>, bounds_west <dbl>, bounds_east <dbl>,
   bounds north <dbl>, bounds south <dbl>, and abbreviated variable names
   1: zipcode_type, 2: major_city, 3: post_office_city, ...
```

#### Pull data for all ZIP codes in the dataset

```
#zipdata <- reverse_zipcode( vax$zip_code_tabulation_area )
```

### Focus on the San Diego area

```
#vax$county == "San Diego"

# Subset to San Diego county only areas
sd <- vax[ vax$county == "San Diego" , ]

library(dplyr)

Attaching package: 'dplyr'

The following objects are masked from 'package:stats':
    filter, lag</pre>
```

```
The following objects are masked from 'package:base':
    intersect, setdiff, setequal, union

sd <- filter(vax, county == "San Diego")
    nrow(sd)

[1] 10593

sd.10 <- filter(vax, county == "San Diego" & age5_plus_population > 10000)

which.max(sd$age12_plus_population)
```

#### [1] 53

Q11. How many distinct zip codes are listed for San Diego County?

There are 107 distinct zip codes listed for San Diego county.

Q12. What San Diego County Zip code area has the largest 12 + Population in this dataset?

#### 92154

```
skimr::skim(sd.10)
```

Table 4: Data summary

| Name                   | sd.10 |
|------------------------|-------|
| Number of rows         | 7524  |
| Number of columns      | 18    |
| Column type frequency: |       |
| character              | 4     |
| Date                   | 1     |
| numeric                | 13    |
|                        |       |

Table 4: Data summary

| Group variables None |
|----------------------|
|----------------------|

## Variable type: character

| skim_variable             | n_missing | complete_ | _rate | min | max | empty | n_unique | whitespace |
|---------------------------|-----------|-----------|-------|-----|-----|-------|----------|------------|
| local_health_jurisdiction | n 0       |           | 1     | 9   | 9   | 0     | 1        | 0          |
| county                    | 0         |           | 1     | 9   | 9   | 0     | 1        | 0          |
| vem_source                | 0         |           | 1     | 23  | 26  | 0     | 2        | 0          |
| redacted                  | 0         |           | 1     | 2   | 69  | 0     | 2        | 0          |

## Variable type: Date

| skim_variable | n_missing | $complete\_rate$ | min        | max        | median     | n_unique |
|---------------|-----------|------------------|------------|------------|------------|----------|
| as_of_date    | 0         | 1                | 2021-01-05 | 2022-11-22 | 2021-12-14 | 99       |

## Variable type: numeric

| skim_variable n_missim          | gmplete          | nreae   | $\operatorname{sd}$ | p0       | p25             | p50      | p75      | p100            | hist |
|---------------------------------|------------------|---------|---------------------|----------|-----------------|----------|----------|-----------------|------|
| zip_code_tabulation_area 0      | 1.00             | 92054.  | .530.78             | 91901    | <b>.9</b> 2017  | .7952070 | .0002113 | .2952173        | .00  |
| vaccine_equity_metric_qua@tile  | 1.00             | 2.86    | 0.94                | 1.0      | 2.00            | 3.00     | 4.00     | 4.00            |      |
| age12_plus_population 0         | 1.00             | 36365.  | .91/5210            | .5170061 | <b>.2</b> 5399  | .937240  | .854737  | 1786365         | .20  |
| age5_plus_population 0          | 1.00             | 39922.  | .216787             | .6110704 | . <b>Q</b> 8218 | .540270  | .549486  | <b>78</b> 2971  | .00  |
| tot_population 0                | 1.00             | 42630.  | .097989             | .651417  | . <b>0</b> 9980 | .0433641 | .003267  | <b>.25</b> 8979 | .00  |
| persons_fully_vaccinated 40     | 0.99             | 24866.  | .665994             | .5B1.0   | 13257           | .2233486 | .5304900 | .5807186        | .00  |
| persons_partially_vaccinat40l   | 0.99             | 3225.3  | 322704.1            | 211.0    | 1716.0          | 02568.0  | 03787.0  | 030455          | .00  |
| percent_of_population_full@_va  | c <b>@199</b> te | d0.58   | 0.25                | 0.0      | 0.49            | 0.64     | 0.73     | 1.00            |      |
| percent_of_population_patoially | 0 <i>:</i> 99ci  | na0t.08 | 0.06                | 0.0      | 0.05            | 0.06     | 0.09     | 0.98            |      |
| percent_of_population_wit0_1_   | p1199_c          | dose64  | 0.25                | 0.0      | 0.55            | 0.70     | 0.79     | 1.00            |      |
| booster_recip_count 2526        | 0.66             | 10206.  | .281011.2           | 2111.0   | 3891.0          | 00068.5  | 5014938  | 7456665         | .00  |
| bivalent_dose_recip_co6588      | 0.12             | 2542.0  | 42258.1             | 811.0    | 701.00          | 2030.5   | 60696.7  | 512081          | .00  |
| eligible_recipient_count 0      | 1.00             | 24712.  | .1176035            | 0.060.0  | 13153           | .020326  | .0304851 | .086696         | .00  |

```
library(dplyr)
sd.11.15 <- sd %>% filter(as_of_date == "2022-11-15")
nrow(sd.11.15)
```

#### [1] 107

```
sd.11.15.vac <- sd.11.15$percent_of_population_fully_vaccinated
sd.11.15.avg <- mean(sd.11.15.vac, na.rm = TRUE)
sd.11.15.avg</pre>
```

#### [1] 0.7369099

Q13. What is the overall average "Percent of Population Fully Vaccinated" value for all San Diego "County" as of "2022-1s-15"?

The overall average of "Percent of Population Fully Vaccinated value for all San Diego county as of 2022-11-15 is 0.7369099.

Q14. Using either ggplot or base R graphics make a summary figure that shows the distribution of Percent of Population Fully Vaccinated values as of "2022-11-15"?

```
#ggplot(sd.11.15) +
# aes(sd.11.15$zip_code_tabulation_area, sd.11.15$percent_of_population_fully_vaccinated)
#geom_bar()
```

Note: I kept getting an error when trying to create a histogram.

## Focus on UCSD/La Jolla

```
ucsd <- filter(sd, zip_code_tabulation_area=="92037")
ucsd[1,]$age5_plus_population</pre>
```

#### [1] 36144

Q15. Using ggplot make a graph of the vaccination rate time course for the 92037 ZIP code area:

```
library(ggplot2)

ggplot(ucsd) +
  aes(ucsd$as_of_date, ucsd$percent_of_population_fully_vaccinated) +
```

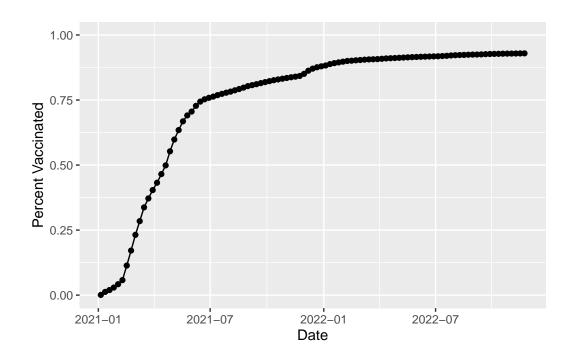
```
geom_point() +
geom_line(group=1) +
ylim(c(0,1)) +
labs(x="Date", y="Percent Vaccinated")
```

Warning: Use of `ucsd\$as\_of\_date` is discouraged. i Use `as\_of\_date` instead.

Warning: Use of `ucsd\$percent\_of\_population\_fully\_vaccinated` is discouraged. i Use `percent\_of\_population\_fully\_vaccinated` instead.

Warning: Use of `ucsd\$as\_of\_date` is discouraged. i Use `as\_of\_date` instead.

Warning: Use of `ucsd\$percent\_of\_population\_fully\_vaccinated` is discouraged. i Use `percent\_of\_population\_fully\_vaccinated` instead.



```
p <- ggplot(ucsd) +
  aes(ucsd$as_of_date, ucsd$percent_of_population_fully_vaccinated) +</pre>
```

```
geom_point() +
geom_line(group=1) +
ylim(c(0,1)) +
labs(x="Date", y="Percent Vaccinated")

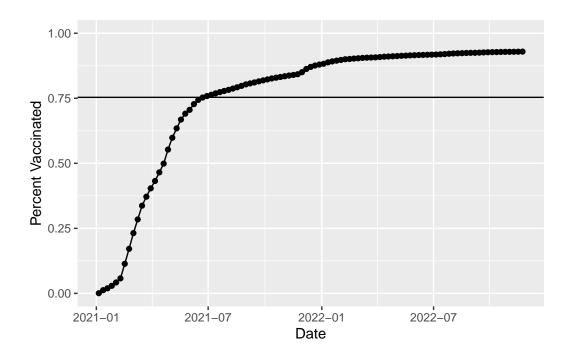
p + geom_hline(yintercept = mean(ucsd*percent_of_population_fully_vaccinated))
```

Warning: Use of `ucsd\$as\_of\_date` is discouraged. i Use `as\_of\_date` instead.

Warning: Use of `ucsd\$percent\_of\_population\_fully\_vaccinated` is discouraged. i Use `percent\_of\_population\_fully\_vaccinated` instead.

Warning: Use of `ucsd\$as\_of\_date` is discouraged. i Use `as\_of\_date` instead.

Warning: Use of `ucsd\$percent\_of\_population\_fully\_vaccinated` is discouraged. i Use `percent\_of\_population\_fully\_vaccinated` instead.



```
m <- mean(ucsd$percent_of_population_fully_vaccinated)
m</pre>
```

#### [1] 0.7535428

Q17. What is the 6 number summary (Min, 1st Qu., Median, Mean, 3rd Qu., and Max) of the "Percent of Population Fully Vaccinated" values for ZIP code areas with a population as large as 92037 (La Jolla) as of date "2022-11-15"?

Min: 0.000760 First Quartile: 0.755672 Median: 0.870625 Third Quartile: 0.915898 Max: 0.929365 Mean: 0.7535428

```
fivenum(ucsd$percent_of_population_fully_vaccinated)
```

[1] 0.000760 0.755672 0.870625 0.915898 0.929365

Q18. Using ggplot generate a histogram of this data.

```
#ggplot(ucsd) +
# aes(ucsd$percent_of_population_fully_vaccinated, ucsd$tot_population) +
#geom_bar()
```

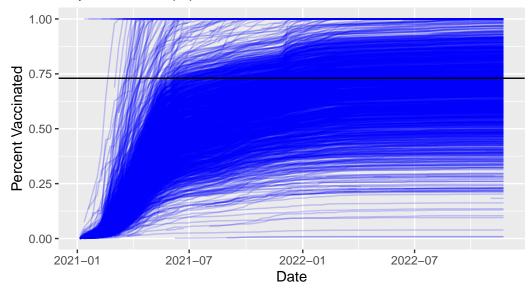
Note: I kept getting an error when trying to create a histogram. > Q19. Is the 92109 and 92040 ZIP code areas above or below the average value you calculated for all these above?

Based on picture in the lab handout, the average value is slightly above.

Q20. Finally make a time course plot of vaccination progress for all areas in the full dataset with a  $age5\_plus\_population > 36144$ .

Warning: Removed 16568 rows containing missing values (`geom\_line()`).

# Vaccination rate across California only areas with a population above 36k are shown



Q21. How do you feel about traveling for Thanksgiving Break and meeting for in-person class afterwards?

This data makes me want to be even more cautious when travelling.