### Class 17: Vaccination Rate Mini-Project

#### Michelle Woo

#### Importing the data

```
# importing the vax data
  vax <- read.csv("covid19vaccinesbyzipcode_test.csv")</pre>
  head(vax)
  as_of_date zip_code_tabulation_area local_health_jurisdiction
                                                                       county
1 2021-01-05
                                 93704
                                                                       Fresno
2 2021-01-05
                                 95684
                                                        El Dorado El Dorado
3 2021-01-05
                                 92273
                                                          Imperial
                                                                     Imperial
4 2021-01-05
                                 93662
                                                            Fresno
                                                                       Fresno
5 2021-01-05
                                 95673
                                                       Sacramento Sacramento
6 2021-01-05
                                 93668
                                                                       Fresno
                                                            Fresno
  vaccine_equity_metric_quartile
                                                   vem_source
1
                                1 Healthy Places Index Score
2
                                2 Healthy Places Index Score
3
                                1 Healthy Places Index Score
4
                                1 Healthy Places Index Score
                                2 Healthy Places Index Score
5
6
                                      CDPH-Derived ZCTA Score
  age12_plus_population age5_plus_population tot_population
                24803.5
                                         27701
                                                        29740
1
2
                 2882.9
                                          3104
                                                          3129
3
                 1633.1
                                          1763
                                                          2010
4
                24501.3
                                         28311
                                                        30725
5
                13671.7
                                         15453
                                                        16636
                 1013.4
                                          1199
                                                          1219
  persons_fully_vaccinated persons_partially_vaccinated
1
                         NA
                                                       NA
2
                         NA
                                                       NA
```

```
3
                          NA
                                                          NA
4
                          NA
                                                          NA
5
                          NA
                                                          NA
6
                          NA
                                                          NA
  percent_of_population_fully_vaccinated
1
2
                                         NA
                                         NA
3
4
                                         NA
5
                                         NA
6
                                         NA
  percent_of_population_partially_vaccinated
1
2
                                              NA
3
                                              NA
4
                                              NA
5
                                              NA
6
                                              NA
  percent_of_population_with_1_plus_dose booster_recip_count
1
                                         NA
                                                               NA
2
                                                               NA
                                         NA
3
                                         NA
                                                               NA
4
                                                               NA
                                         NA
5
                                         NA
                                                               NA
6
                                         NA
                                                               NA
  bivalent_dose_recip_count eligible_recipient_count
1
                           NA
2
                                                        0
                           NA
3
                           NA
                                                        1
4
                           NA
                                                        1
5
                                                        3
                           NA
6
                           NA
                                                        0
  eligible_bivalent_recipient_count
1
                                     5
2
                                     0
3
                                     0
4
                                     1
5
                                     3
6
                                     0
                                                                     redacted
1 Information redacted in accordance with CA state privacy requirements
```

2 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

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

colnames(vax)

- [1] "as\_of\_date"
- [2] "zip\_code\_tabulation\_area"
- [3] "local\_health\_jurisdiction"
- [4] "county"
- [5] "vaccine\_equity\_metric\_quartile"
- [6] "vem\_source"
- [7] "age12\_plus\_population"
- [8] "age5\_plus\_population"
- [9] "tot\_population"
- [10] "persons\_fully\_vaccinated"
- [11] "persons\_partially\_vaccinated"
- [12] "percent\_of\_population\_fully\_vaccinated"
- [13] "percent\_of\_population\_partially\_vaccinated"
- [14] "percent\_of\_population\_with\_1\_plus\_dose"
- [15] "booster\_recip\_count"
- [16] "bivalent\_dose\_recip\_count"
- [17] "eligible\_recipient\_count"
- [18] "eligible\_bivalent\_recipient\_count"
- [19] "redacted"

persons fully vaccinated

#### Q2. What column details the Zip code tabulation area?

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?

2023-05-23

### Using skim() to get an overview

skimr::skim\_without\_charts(vax)

Table 1: Data summary

Name	vax
Number of rows	222264
Number of columns	19
Column type frequency:	
character	5
numeric	14
Group variables	None

#### Variable type: character

skim_variable	n_missing	complete_ra	te min	max	empty	n_unique	whitespace
as_of_date	0	1	10	10	0	126	0
local_health_jurisdiction	0	1	0	15	630	62	0
county	0	1	0	15	630	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_miss	si <b>ng</b> mplete_	matæn	$\operatorname{sd}$	p0	p25	p50	p75	p100
zip_code_tabulation_ar	ea 0	1.00	93665	.11817.3	89000	192257.	7 <b>9</b> 3658	.595380	.5 <b>97</b> 635.0
vaccine_equity_metric_	q <b>ul09612</b>	0.95	2.44	1.11	1	1.00	2.00	3.00	4.0
age12_plus_population	0	1.00	18895	.048993.	.87 0	1346.9	513685	.1 <b>0</b> 1756	.1 <b>2</b> 8556.7
$age5\_plus\_population$	0	1.00	20875	.221105.	96 0	1460.5	015364	.0 <b>0</b> 4877	0001902.
$tot\_population$	10836	0.95	23372	.7 <b>2</b> 2628.	5012	2126.0	018714	.0 <b>6</b> 8168	.0011165.
persons_fully_vaccinated	d 17848	0.92	14299	.495281.	9411	957.00	9034.0	0023818	.0 <b>07</b> 721.0
persons_partially_vaccin	na <b>t#8</b> 48	0.92	1712.0	082075.0	3 11	164.00	1204.0	002551.0	043152.0
percent_of_population_	fu <b>lly7</b> 2 <b>0</b> a	ccinatell	0.58	0.25	0	0.44	0.62	0.75	1.0
percent_of_population_	p <b>22720</b> y	_vac@i <b>9</b> @te	ed0.08	0.09	0	0.05	0.06	0.08	1.0
percent_of_population_	w <b>26883</b> _	_plus <u>0.</u> 80se	0.65	0.24	0	0.50	0.68	0.82	1.0
booster_recip_count	74543	0.66	6417.2	227795.1	3 11	331.00	3135.0	0010344	060058.0

skim_variable n_r	missi <b>ng</b> mplete_	<b>ma</b> tæn	$\operatorname{sd}$	p0	p25	p50	p75	p100
bivalent_dose_recip_count60	089 0.28	3438.2	24034.61	11	225.00	1863.0	05532.0	029593.0
$eligible\_recipient\_count$	0   1.00	13145.	145144.25	2 0	537.00	6691.0	0022558	007442.0
eligible_bivalent_recipient_co	o <b>0</b> nt 1.00	13038.	2 <b>4</b> 5218.39	9 0	263.00	6583.0	0022550	087442.0

#### Q5. How many numeric columns are in the dataset?

```
numeric_columns <- sapply(vax, is.numeric)
num_numeric_columns <- sum(numeric_columns)
num_numeric_columns</pre>
```

[1] 14

#### Q6. How many NA values are there in the persons\_fully\_vaccinated column?

```
sum(is.na(vax$persons_fully_vaccinated))
[1] 17848
17711 (previous dataset)
17848 (updated)
```

#### Q7. What percent of persons\_fully\_vaccinated values are missing?

```
# finding the total value
total_value <- nrow(vax)

# taken from Q6.
num_na_values <- sum(is.na(vax$persons_fully_vaccinated))

# finding the percentage
percentage_missing <- (num_na_values / total_value) * 100

percentage_missing</pre>
```

[1] 8.03009

#### Q8. Why might this data be missing?

The data might be missing because it is difficult to collect all data from many people for reasons such as having confidential restrictions, inaccurate census data, or difficulty in reaching all sorts of people in all of the state, not just the major cities.

#### Working with dates

```
# using lubridate to format our data
library(lubridate)

Attaching package: 'lubridate'

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

today()

[1] "2023-05-31"

# year-month-day format
    vax$as_of_date <- ymd(vax$as_of_date)</pre>
```

With the new format, we can do math with the dates. Such as answering the question: how many days have passed since the first vaccination reported in the dataset?:

```
today() - vax$as_of_date[1]
```

Time difference of 876 days

And days the dataset spans:

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

Q9: How many days have passed since the last update of the dataset?

```
# from the last row of the date to today
today() - ymd(vax$as_of_date[nrow(vax)])

Time difference of 1 days
8 day (from previous dataset)
1 day (updated)
```

Q10: How many unique dates are in the dataset (how many different dates are detailed)?

```
# using length to count the vector
length(unique(vax$as_of_date))

[1] 126

125 unique dates (in old dataset)

126 (updated)
```

#### Working with ZIP codes

Using zipcodeR:

```
# distance between two zipcodes
  zip_distance('92037','92109')
 zipcode_a zipcode_b distance
     92037
               92109
                          2.33
  # pulling census data
  reverse_zipcode(c('92037','92109'))
# A tibble: 2 x 24
 zipcode zipcode_type major_city post_office_city common_city_list county state
         <chr>
                       <chr>
                                  <chr>>
                                                             <blook> <chr> <chr>
1 92037
         Standard
                       La Jolla
                                  La Jolla, CA
                                                        <raw 20 B> San D~ CA
2 92109
                       San Diego San Diego, CA
                                                         <raw 21 B> San D~ CA
         Standard
# i 17 more variables: lat <dbl>, lng <dbl>, timezone <chr>,
   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>
  # Pull data for all ZIP codes in the dataset
  zipdata <- reverse_zipcode( vax$zip_code_tabulation_area )</pre>
```

#### Focusing on the SD area

```
# subset to SD area
sd <- vax[vax$county == "San Diego", ]
or using dplyr:
library(dplyr)

Attaching package: 'dplyr'</pre>
```

```
The following objects are masked from 'package:stats':
    filter, lag
The following objects are masked from 'package:base':
    intersect, setdiff, setequal, union
  sd <- filter(vax, county == "San Diego")</pre>
  nrow(sd)
[1] 13482
Q11. How many distinct zip codes are listed in the SD County?
  length(unique(sd$zip_code_tabulation_area))
Γ1] 107
Q12. What SD County Zip code area has the largest population in this dataset?
  largest <- sd[sd$age5_plus_population == max(sd$age5_plus_population),]</pre>
  unique(largest$zip_code_tabulation_area)
[1] 92154
ZIP code: 92154
Q13. What is the overall average for all SD county as of 2023-05-23?
  # using tidyverse approach
  sd_may23 <- filter(sd, as_of_date == '2023-05-23')</pre>
  # 107 zip codes
  dim(sd_may23)
```

[1] 107 19

```
# finding the mean
mean(sd_may23$percent_of_population_fully_vaccinated, na.rm = T)
```

#### [1] 0.7419992

An average of 0.74 / 74% of people are fully vaccinated in the SD county.

## Q14. Make a summary figure that shows the distribution of Percent of Population Fully Vaccinated values as of 2023-05-23

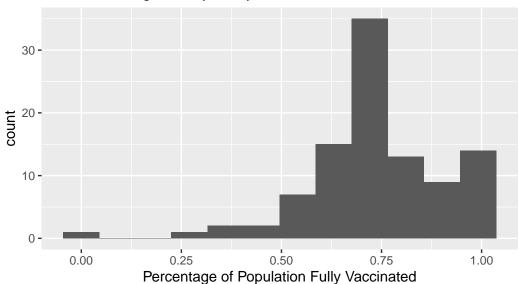
```
# ggplot
library(ggplot2)

ggplot(sd_may23) +
   aes(percent_of_population_fully_vaccinated) +
   geom_histogram(bins = 12) +
   labs(title = 'Vaccination Rates',
        subtitle = 'Across San Diego County - May 23, 2023',
        x = 'Percentage of Population Fully Vaccinated')
```

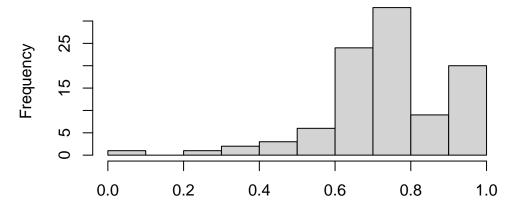
Warning: Removed 8 rows containing non-finite values (`stat\_bin()`).

#### Vaccination Rates

Across San Diego County - May 23, 2023



# Vaccination Rates San Diego County – May 23,2023



Percentage of Population Fully Vaccinated

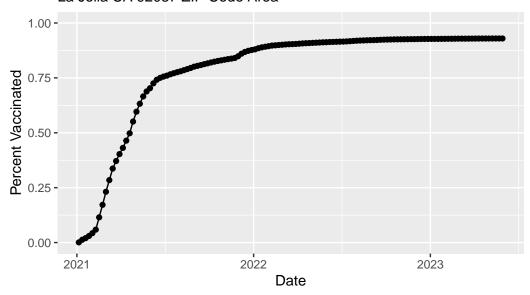
#### Focusing on UCSD/La Jolla

```
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

```
ggplot(ucsd) +
  aes(as_of_date,
      percent_of_population_fully_vaccinated) +
  geom_point() +
  geom_line(group = 1) +
```

## Vaccination Rates La Jolla CA 92037 ZIP Code Area



#### Comparing to similar sized areas

Let's return to the full dataset and look across every zip code area with a population at least as large as that of 92037 on  $as\_of\_date$  "2023-05-23"

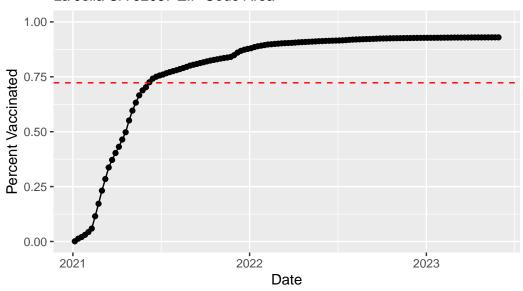
```
as_of_date zip_code_tabulation_area local_health_jurisdiction county
1 2023-05-23 90805 Long Beach Los Angeles
2 2023-05-23 93257 Tulare Tulare
3 2023-05-23 90004 Los Angeles Los Angeles
```

```
4 2023-05-23
                                 90808
                                                        Long Beach Los Angeles
5 2023-05-23
                                 95355
                                                        Stanislaus Stanislaus
                                  90802
6 2023-05-23
                                                        Long Beach Los Angeles
                                                   vem_source
  vaccine_equity_metric_quartile
1
                                 1 Healthy Places Index Score
2
                                 1 Healthy Places Index Score
3
                                 1 Healthy Places Index Score
4
                                4 Healthy Places Index Score
5
                                2 Healthy Places Index Score
6
                                1 Healthy Places Index Score
  age12_plus_population age5_plus_population tot_population
                77165.9
                                         88279
                                                         95995
1
2
                61519.8
                                         70784
                                                         76519
3
                52412.5
                                         57024
                                                         60541
4
                 33952.3
                                         37179
                                                         39330
5
                50941.6
                                         56248
                                                         59621
                35238.1
                                         37017
                                                         38962
  persons_fully_vaccinated persons_partially_vaccinated
                      62829
                                                      6949
1
2
                      45117
                                                      5629
3
                      47272
                                                      5963
4
                      30283
                                                      2375
5
                      39616
                                                      3210
                      28152
                                                      3711
  percent_of_population_fully_vaccinated
1
                                 0.654503
2
                                 0.589618
3
                                 0.780826
4
                                 0.769972
5
                                  0.664464
                                 0.722550
  percent_of_population_partially_vaccinated
1
                                      0.072389
2
                                      0.073563
3
                                      0.098495
4
                                      0.060386
5
                                      0.053840
6
                                      0.095247
  percent_of_population_with_1_plus_dose booster_recip_count
                                 0.726892
1
                                                          33175
2
                                                          22223
                                 0.663181
3
                                 0.879321
                                                          29130
4
                                 0.830358
                                                          20463
```

```
5
                                  0.718304
                                                            22873
6
                                  0.817797
                                                            17033
  bivalent_dose_recip_count eligible_recipient_count
                        10919
1
                                                   62713
2
                         5297
                                                   45104
3
                        12081
                                                   47148
4
                         9676
                                                   30203
5
                         8291
                                                   39588
6
                         7169
                                                   28107
  eligible_bivalent_recipient_count redacted
1
                                62713
                                             No
2
                                45104
                                             No
3
                                47148
                                             No
4
                                30203
                                             No
5
                                39588
                                             No
6
                                28107
                                             No
```

Q16. Calculate the mean "Percent of Population Fully Vaccinated" for ZIP code areas with a population as large as 92037 (La Jolla) as\_of\_date "2023-05-23". Add this as a straight horizontal line to your plot from above with the geom\_hline() function:

# Vaccination Rates La Jolla CA 92037 ZIP Code Area



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 "2023-05-23"?

```
summary(vax.36$percent_of_population_fully_vaccinated)

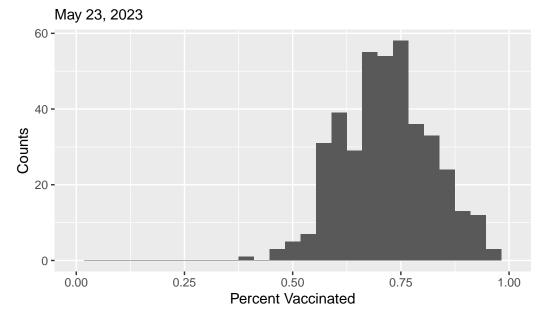
Min. 1st Qu. Median Mean 3rd Qu. Max.
0.3815 0.6470 0.7208 0.7227 0.7923 1.0000
```

#### Q18. Using ggplot, generate a histogram of this data:

```
ggplot(vax.36) +
   aes(percent_of_population_fully_vaccinated) +
   geom_histogram(bins = 29) +
   xlim(c(0,1)) +
   labs(title = 'Vaccination Rates',
        subtitle = 'May 23, 2023',
        x = 'Percent Vaccinated',
        y= 'Counts')
```

Warning: Removed 2 rows containing missing values (`geom\_bar()`).

#### Vaccination Rates



Q19. Is the 92109 and 92040 ZIP code areas above or below the average value you calculated for all these above?

Both below

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

```
vax.36.all <- filter(vax, age5_plus_population > 36144)

ggplot(vax.36.all) +
   aes(as_of_date,
        percent_of_population_fully_vaccinated,
        group=zip_code_tabulation_area) +
   geom_line(alpha=0.2, color='darkolivegreen4') +
   ylim(0,1) +
   labs(x = 'Date', y = 'Percent Vaccinated',
        title = 'Vaccination Rate Across California',
        subtitle = 'Only areas with population above 36k are shown') +
   geom_hline(yintercept = 0.722, linetype = 'dashed', color = 'forestgreen')
```

Warning: Removed 185 rows containing missing values (`geom\_line()`).

#### Vaccination Rate Across California

Only areas with population above 36k are shown

