class18

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Background

Pertussis (a.k.a whooping cough) is a common lung infection caused by the bacteria *B.Pertussis*.

The CDC tracks cases of Pertussis in the US: https://www.cdc.gov/pertussis/php/surveillance/pertussis-cases-by-year.html

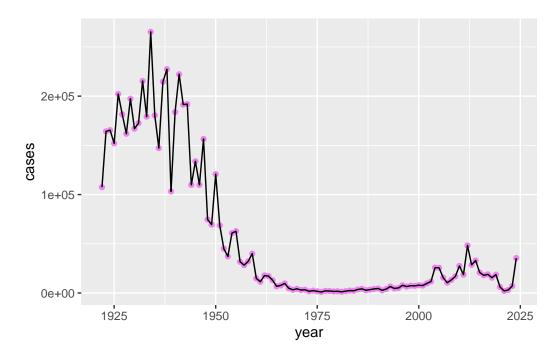
Examining cases of Pertussis by year

We can use

head(cdc)

```
year cases
1 1922 107473
2 1923 164191
3 1924 165418
4 1925 152003
5 1926 202210
6 1927 181411
```

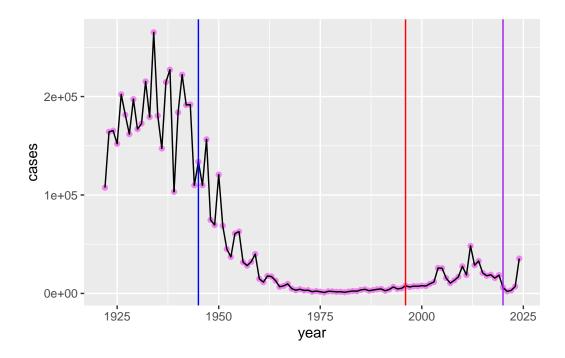
Q1. Make a plot of pertussis cases peryear using ggplot



Q2. Add some key time points in our history of interaction with Pertussis. These includewP roll-out (the first vaccine) in 1945 and the switch to aP in 1996

We can use geom_vline() for this

```
cases + geom_vline(xintercept =1945, col="blue") +
    geom_vline(xintercept =1996, col="red") +
    geom_vline(xintercept = 2020, col="purple")
```



Q3. Describe what happened after the introduction of the aP vaccine? Do you have a possible explanation for the observed trend?

Mounting ecidence suggests that the newer \mathbf{aP} vaccine is less effective over the long term than the older \mathbf{wP} vaccine that it replaced. In other, words, vaccine protection wanes more rappidly with \mathbf{aP} than with \mathbf{wP} .

Enter the CMI-PB project

CMI-PB (computational Models of Immunity - Pertussis boost) major goal is to incestigate how the immune responds differently to with aP vs wP vaccinated individuals and be able to predict this at an erarly stage.

CMI-PB makes all their collected data freely avavilable and they store it in a database composed different tables.

We can use the **jsonlite** package to read this data

```
library(jsonlite)
subject <- read_json("https://www.cmi-pb.org/api/subject", simplifyVector = TRUE)
head(subject, 3)</pre>
```

```
subject_id infancy_vac biological_sex
                                                       ethnicity race
                                  Female Not Hispanic or Latino White
1
           1
2
           2
                      wP
                                  Female Not Hispanic or Latino White
3
           3
                      wP
                                  Female
                                                         Unknown White
 year_of_birth date_of_boost
                                    dataset
1
     1986-01-01
                   2016-09-12 2020_dataset
2
     1968-01-01
                   2019-01-28 2020_dataset
3
     1983-01-01
                   2016-10-10 2020_dataset
```

Q. How many subjects (i.e. enrolled people) are there in this dataset?

nrow(subject)

[1] 172

Q. How many "aP" and "wP" subjects are there?

table(subject\$infancy_vac)

aP wP 87 85

Q. How many Male/Female are in the dataset?

table(subject\$biological_sex)

Female Male 112 60

Q. How about gender and race number

table(subject\$race,subject\$biological_sex)

	Female	Male
American Indian/Alaska Native	0	1
Asian	32	12
Black or African American	2	3
More Than One Race	15	4
Native Hawaiian or Other Pacific Islander	1	1
Unknown or Not Reported	14	7
White	48	32

Q. Is this representative of the US population?

No, UCSD student population

Let's read another database table from CMI-PB

head(specimen)

```
specimen_id subject_id actual_day_relative_to_boost
1
             1
2
             2
                         1
                                                          1
3
             3
                         1
                                                          3
                                                          7
4
             4
                         1
             5
5
                         1
                                                         11
             6
                         1
                                                         32
 planned_day_relative_to_boost specimen_type visit
1
                                 0
                                            Blood
                                                        1
2
                                 1
                                            Blood
                                                        2
3
                                 3
                                            Blood
                                                        3
4
                                 7
                                            Blood
                                                        4
5
                                14
                                            Blood
                                                        5
                                            Blood
6
                                                        6
                                30
```

head(ab_data)

```
specimen_id isotype is_antigen_specific antigen
                                                            MFI MFI_normalised
1
            1
                   IgE
                                      FALSE
                                              Total 1110.21154
                                                                       2.493425
2
            1
                                              Total 2708.91616
                   IgE
                                      FALSE
                                                                       2.493425
3
            1
                   IgG
                                       TRUE
                                                 PΤ
                                                       68.56614
                                                                       3.736992
4
                                                     332.12718
            1
                   IgG
                                       TRUE
                                                PRN
                                                                       2.602350
5
            1
                   IgG
                                       TRUE
                                                FHA 1887.12263
                                                                      34.050956
            1
                   IgE
                                       TRUE
                                                ACT
                                                        0.10000
                                                                       1.000000
   unit lower_limit_of_detection
1 UG/ML
                         2.096133
2 IU/ML
                        29.170000
3 IU/ML
                         0.530000
```

```
4 IU/ML 6.205949
5 IU/ML 4.679535
6 IU/ML 2.816431
```

We want to "join" these tables to get all our information together. For this we will use the **dplyr** package and **inner_join()** function.

library(dplyr)

```
Attaching package: 'dplyr'
```

The following objects are masked from 'package:stats':

```
filter, lag
```

The following objects are masked from 'package:base':

intersect, setdiff, setequal, union

```
meta <- inner_join(subject, specimen)</pre>
```

Joining with `by = join_by(subject_id)`

head(meta)

	<pre>subject_id inf</pre>	fancy_vac biolo	ogical_sex		eth	nicity	race
1	1	wP	Female Not	Hispanic	or	${\tt Latino}$	${\tt White}$
2	1	wP	Female Not	Hispanic	or	${\tt Latino}$	${\tt White}$
3	1	wP	Female Not	Hispanic	or	${\tt Latino}$	White
4	1	wP	Female Not	Hispanic	or	Latino	White
5	1	wP	Female Not	Hispanic	or	${\tt Latino}$	White
6	1	wP	Female Not	Hispanic	or	${\tt Latino}$	White
	<pre>year_of_birth</pre>	${\tt date_of_boost}$	dataset	specimen_i	id		
1	1986-01-01	2016-09-12	2020_dataset		1		
2	1986-01-01	2016-09-12	2020_dataset		2		
3	1986-01-01	2016-09-12	2020_dataset		3		
4	1986-01-01	2016-09-12	2020_dataset		4		
5	1986-01-01	2016-09-12	2020_dataset		5		

```
6
     1986-01-01
                    2016-09-12 2020_dataset
  actual_day_relative_to_boost planned_day_relative_to_boost specimen_type
                              -3
                                                                0
                                                                            Blood
1
2
                               1
                                                                1
                                                                           Blood
3
                               3
                                                                3
                                                                           Blood
                               7
                                                                7
4
                                                                           Blood
5
                              11
                                                                14
                                                                           Blood
6
                              32
                                                                30
                                                                            Blood
  visit
1
      1
2
      2
3
      3
4
      4
      5
5
      6
```

One more "join" to get ab_data

```
abdata <- inner_join(meta, ab_data)
```

Joining with `by = join_by(specimen_id)`

head(abdata)

```
subject_id infancy_vac biological_sex
                                                       ethnicity race
1
           1
                      wP
                                  Female Not Hispanic or Latino White
2
           1
                      wP
                                  Female Not Hispanic or Latino White
3
           1
                      wP
                                  Female Not Hispanic or Latino White
4
           1
                      wP
                                  Female Not Hispanic or Latino White
5
           1
                      wP
                                  Female Not Hispanic or Latino White
                      wP
                                  Female Not Hispanic or Latino White
6
           1
  year_of_birth date_of_boost
                                    dataset specimen_id
     1986-01-01
                   2016-09-12 2020 dataset
1
2
     1986-01-01
                   2016-09-12 2020_dataset
3
     1986-01-01
                   2016-09-12 2020_dataset
                                                       1
4
     1986-01-01
                   2016-09-12 2020_dataset
                                                       1
5
     1986-01-01
                   2016-09-12 2020_dataset
                                                       1
     1986-01-01
                   2016-09-12 2020_dataset
                                                       1
  actual_day_relative_to_boost planned_day_relative_to_boost specimen_type
                             -3
                                                             0
                                                                       Blood
1
2
                             -3
                                                             0
                                                                       Blood
```

```
3
                              -3
                                                              0
                                                                         Blood
4
                              -3
                                                               0
                                                                         Blood
5
                              -3
                                                               0
                                                                         Blood
6
                              -3
                                                               0
                                                                         Blood
  visit isotype is_antigen_specific antigen
                                                      MFI MFI_normalised unit
1
                                FALSE
                                        Total 1110.21154
                                                                 2.493425 UG/ML
            IgE
2
      1
            IgE
                                FALSE
                                        Total 2708.91616
                                                                 2.493425 IU/ML
3
      1
            IgG
                                 TRUE
                                           PΤ
                                                 68.56614
                                                                 3.736992 IU/ML
4
      1
            IgG
                                 TRUE
                                          PRN 332.12718
                                                                 2.602350 IU/ML
                                 TRUE
                                          FHA 1887.12263
                                                                34.050956 IU/ML
5
      1
            IgG
6
      1
                                 TRUE
                                          ACT
                                                  0.10000
                                                                 1.000000 IU/ML
            IgE
  lower_limit_of_detection
1
                   2.096133
2
                  29.170000
3
                   0.530000
4
                   6.205949
5
                   4.679535
6
                   2.816431
```

dim(abdata)

[1] 61956 20

Q. How many Ab isotypes are there in the dataset?

table(abdata\$isotype)

```
IgE IgG IgG1 IgG2 IgG3 IgG4
6698 7265 11993 12000 12000 12000
```

Q. How many different antigens are measured in the dataset?

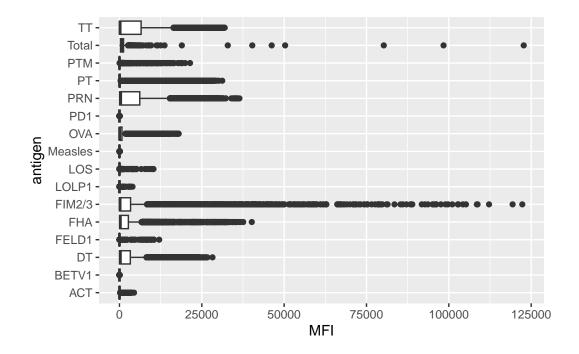
table(abdata\$antigen)

ACT	BETV1	DT	FELD1	FHA	FIM2/3	LOLP1	LOS	Measles	OVA
1970	1970	6318	1970	6712	6318	1970	1970	1970	6318
PD1	PRN	PT	PTM	Total	TT				
1970	6712	6712	1970	788	6318				

Q. Make a boxplot of antigen levels across the whole dataset

```
ggplot(abdata) +
  aes(MFI, antigen) +
  geom_boxplot()
```

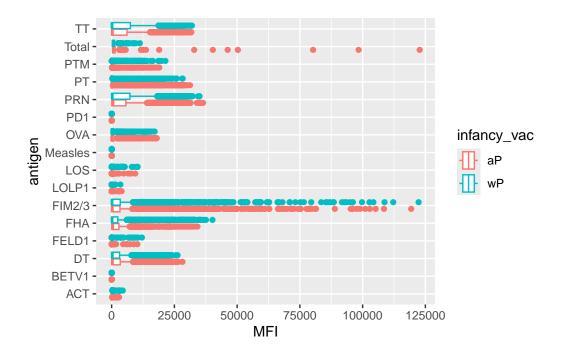
Warning: Removed 1 row containing non-finite outside the scale range (`stat_boxplot()`).



Q. Are there obvious differenes between aP and wP values

```
ggplot(abdata) +
  aes(MFI, antigen, col=infancy_vac) +
  geom_boxplot()
```

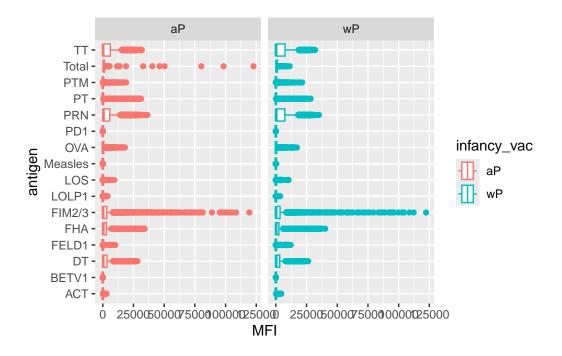
Warning: Removed 1 row containing non-finite outside the scale range (`stat_boxplot()`).



Or we can infancy_vac to get two individual plots one for each value of infancy_vac

```
ggplot(abdata) +
  aes(MFI, antigen, col=infancy_vac) +
  geom_boxplot() +
  facet_wrap(~infancy_vac)
```

Warning: Removed 1 row containing non-finite outside the scale range (`stat_boxplot()`).

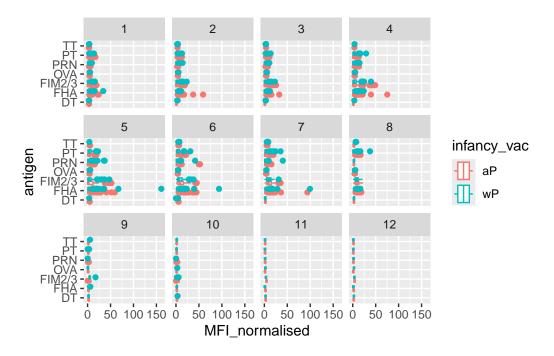


viral infections.

```
igg <- abdata |>
  filter(isotype == "IgG")
head(igg)
```

```
subject_id infancy_vac biological_sex
                                                       ethnicity race
                                  Female Not Hispanic or Latino White
1
                      wP
2
           1
                      wP
                                  Female Not Hispanic or Latino White
3
           1
                      wΡ
                                  Female Not Hispanic or Latino White
4
           1
                      wP
                                  Female Not Hispanic or Latino White
5
           1
                      wP
                                  Female Not Hispanic or Latino White
6
           1
                      wP
                                  Female Not Hispanic or Latino White
                                    dataset specimen id
  year_of_birth date_of_boost
1
     1986-01-01
                   2016-09-12 2020_dataset
2
     1986-01-01
                   2016-09-12 2020_dataset
                                                       1
3
     1986-01-01
                   2016-09-12 2020_dataset
                                                       1
4
     1986-01-01
                   2016-09-12 2020_dataset
                                                       2
     1986-01-01
                   2016-09-12 2020_dataset
                                                       2
5
                                                       2
6
     1986-01-01
                   2016-09-12 2020_dataset
  actual_day_relative_to_boost planned_day_relative_to_boost specimen_type
1
                             -3
                                                                        Blood
```

```
2
                             -3
                                                            0
                                                                       Blood
3
                             -3
                                                            0
                                                                       Blood
4
                             1
                                                            1
                                                                       Blood
5
                              1
                                                             1
                                                                       Blood
6
                                                                       Blood
                              1
                                                             1
  visit isotype is_antigen_specific antigen
                                                    MFI MFI_normalised unit
                                                               3.736992 IU/ML
            IgG
                                TRUE
                                          PΤ
                                               68.56614
2
      1
            IgG
                                TRUE
                                         PRN 332.12718
                                                               2.602350 IU/ML
3
      1
            IgG
                                TRUE
                                         FHA 1887.12263
                                                              34.050956 IU/ML
4
      2
            IgG
                                TRUE
                                          PΤ
                                               41.38442
                                                               2.255534 IU/ML
5
      2
                                         PRN 174.89761
                                                              1.370393 IU/ML
            IgG
                                TRUE
      2
            IgG
                               TRUE
                                         FHA 246.00957
                                                              4.438960 IU/ML
  lower_limit_of_detection
1
                  0.530000
2
                  6.205949
3
                  4.679535
4
                  0.530000
5
                  6.205949
6
                  4.679535
ggplot(igg) +
  aes(MFI_normalised, antigen, col=infancy_vac) +
  geom_boxplot() +
  facet_wrap(~visit)
```



Focus in furthwer in jsut one of these anitgens - let's pick \mathbf{PT} (Pertussis Toxin, one of the main toxins of the bacteria)

```
table(igg$dataset)
```

```
2020_dataset 2021_dataset 2022_dataset 2023_dataset 1182 1617 1456 3010
```

```
subject_id infancy_vac biological_sex
                                                       ethnicity
1
          61
                                  Female Not Hispanic or Latino
                      wP
2
          61
                                  Female Not Hispanic or Latino
                      wP
3
          61
                      wP
                                  Female Not Hispanic or Latino
4
                      wP
          61
                                  Female Not Hispanic or Latino
5
          61
                      wP
                                  Female Not Hispanic or Latino
```

```
6
          61
                      wΡ
                                  Female Not Hispanic or Latino
                     race year_of_birth date_of_boost
                                                             dataset specimen_id
1 Unknown or Not Reported
                              1987-01-01
                                            2019-04-08 2021_dataset
                                                                              468
2 Unknown or Not Reported
                                            2019-04-08 2021_dataset
                              1987-01-01
                                                                              469
3 Unknown or Not Reported
                                            2019-04-08 2021 dataset
                              1987-01-01
                                                                              470
4 Unknown or Not Reported
                                            2019-04-08 2021_dataset
                              1987-01-01
                                                                              471
5 Unknown or Not Reported
                              1987-01-01
                                            2019-04-08 2021 dataset
                                                                              472
6 Unknown or Not Reported
                              1987-01-01
                                            2019-04-08 2021_dataset
                                                                              473
  actual_day_relative_to_boost planned_day_relative_to_boost specimen_type
1
                             -4
                                                             0
                                                                        Blood
2
                              1
                                                             1
                                                                        Blood
3
                              3
                                                             3
                                                                        Blood
                              7
                                                             7
4
                                                                        Blood
5
                                                            14
                             14
                                                                        Blood
                             30
                                                            30
                                                                        Blood
  visit isotype is_antigen_specific antigen
                                                 MFI MFI_normalised unit
1
      1
            IgG
                               FALSE
                                          PT 112.75
                                                          1.0000000 MFI
      2
2
                               FALSE
                                          PT 111.25
                                                          0.9866962 MFI
            IgG
3
      3
            IgG
                               FALSE
                                          PT 125.50
                                                          1.1130820 MFI
4
      4
            IgG
                               FALSE
                                          PT 224.25
                                                          1.9889135 MFI
                                                          2.6962306 MFI
5
      5
            IgG
                               FALSE
                                          PT 304.00
                                          PT 274.00
                                                          2.4301552 MFI
      6
            IgG
                               FALSE
  lower_limit_of_detection
                  5.197441
1
2
                  5.197441
3
                  5.197441
4
                  5.197441
5
                  5.197441
6
                  5.197441
```

dim(pt_igg)

[1] 231 20

```
ggplot(pt_igg) +
  aes(actual_day_relative_to_boost, MFI_normalised,
      col = infancy_vac,
      # connect lines with the same subject_id
      group=subject_id) +
  geom_point() +
  geom_line() +
```

```
theme_bw() +
geom_vline(xintercept = 0) +
geom_vline(xintercept = 14)
```

