

Covid 19 Vaccine Analysis Milestone 2

October 2, 2024

0.0.1 Cleaning Flat File

```
[2]: import pandas as pd
import numpy as np
import requests
from bs4 import BeautifulSoup
```

```
[3]: # read file
```

```
[4]: covid_df = pd.read_csv("/Users/yuhang/Desktop/DSC540/term_project/
↳COVID-19_Vaccinations_in_the_US.csv")
covid_df.head(10)
```

```
[4]:
```

	Date	MMWR_week	Location	Distributed	Distributed_Janssen	\
0	05/10/2023	19	NE	5481710	152400	
1	05/10/2023	19	LA	10282120	330500	
2	05/10/2023	19	GA	28727475	869100	
3	05/10/2023	19	WY	1281755	49300	
4	05/10/2023	19	CO	17769135	501900	
5	05/10/2023	19	PA	42895735	1569200	
6	05/10/2023	19	DE	3352025	102600	
7	05/10/2023	19	OR	14222125	466700	
8	05/10/2023	19	WI	16474175	457200	
9	05/10/2023	19	ND	1910860	53600	

	Distributed_Moderna	Distributed_Pfizer	Distributed_Novavax	\
0	1647380	2905630	7400.0	
1	3807980	5164550	10100.0	
2	9763000	14773655	43400.0	
3	490040	585605	3700.0	
4	5402640	9029715	43600.0	
5	13941120	21178525	87400.0	
6	1071000	1651775	5800.0	
7	4482360	7060535	25900.0	
8	5144600	8183105	22900.0	
9	600920	990720	2800.0	

	Distributed_Unk_Manuf	Dist_Per_100K	...	Dist_Bivalent_PFR	\
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0	0	283379	...	575480.0
1	0	221178	...	640590.0
2	0	270569	...	2255000.0
3	0	221466	...	102510.0
4	0	308560	...	2033760.0
5	0	335071	...	4206470.0
6	0	344234	...	357750.0
7	0	337198	...	1631890.0
8	0	282943	...	1815090.0
9	0	250749	...	203500.0

	Dist_Bivalent_MOD	Bivalent_Booster_5Plus	Bivalent_Booster_5Plus_Pop_Pct	\
0	193420.0	340508.0		18.9
1	328400.0	359506.0		8.3
2	1023320.0	1126791.0		11.3
3	50600.0	65920.0		12.1
4	757520.0	1268501.0		23.4
5	1913020.0	2404885.0		19.9
6	163100.0	206298.0		22.4
7	554740.0	944587.0		23.7
8	851280.0	1330586.0		24.2
9	59320.0	120653.0		17.0

	Bivalent_Booster_12Plus	Bivalent_Booster_12Plus_Pop_Pct	\
0	332054.0	20.5	
1	356199.0	9.1	
2	1103841.0	12.3	
3	64919.0	13.2	
4	1229981.0	24.9	
5	2349980.0	21.2	
6	202637.0	24.1	
7	913832.0	25.1	
8	1298038.0	26.0	
9	117294.0	18.4	

	Bivalent_Booster_18Plus	Bivalent_Booster_18Plus_Pop_Pct	\
0	319161.0	21.9	
1	349934.0	9.8	
2	1067468.0	13.2	
3	63244.0	14.2	
4	1176686.0	26.2	
5	2271654.0	22.3	
6	196313.0	25.5	
7	874306.0	26.1	
8	1251270.0	27.5	
9	112872.0	19.4	

	Bivalent_Booster_65Plus	Bivalent_Booster_65Plus_Pop_Pct
0	151146.0	48.4
1	184844.0	24.9
2	476297.0	31.4
3	34832.0	35.1
4	462990.0	55.0
5	1105455.0	46.2
6	101880.0	53.9
7	371182.0	48.5
8	600688.0	59.1
9	56881.0	47.5

[10 rows x 109 columns]

```
[5]: # covid_df.describe()
```

```
[6]: # covid_df.columns.values
```

```
[7]: # step 1 check if there is null values
```

```
[8]: covid_df.isnull().sum().values
```

```
[8]: array([ 0, 0, 0, 0, 0, 0, 0, 35800, 0,
          0, 448, 0, 0, 0, 0, 448, 0, 0,
          0, 0, 0, 0, 35807, 3, 0, 448, 0,
          0, 0, 0, 0, 0, 448, 448, 0, 0,
          0, 0, 0, 0, 0, 0, 448, 448, 0,
          0, 0, 0, 0, 0, 0, 0, 0, 35808,
          4, 21016, 21016, 21016, 21020, 0, 0, 0, 4,
          0, 0, 0, 4, 0, 0, 0, 9, 16348,
          325, 35544, 35544, 26456, 26456, 325, 325, 325, 0,
          325, 325, 325, 325, 327, 331, 38385, 31896, 31896,
          31896, 31896, 31905, 31896, 31896, 31907, 36248, 36312, 36312,
          36312, 36312, 36568, 36568, 36504, 36504, 36504, 36504, 36504,
          36504])
```

```
[9]: covid_df.shape
```

```
[9]: (38488, 109)
```

```
[10]: # step 2 select only some of them out of 109 columns
```

```
[11]: covid_new = covid_df[["Date", "Location", "Distributed", "Administered",
↪ "Administered_5Plus", "Administered_12Plus",\
↪ "Administered_18Plus", "Administered_65Plus",\
↪ "Administered_Moderna",\
```

```

      "Additional_Doses", "Additional_Doses_5Plus", \
    ↪ "Additional_Doses_12Plus", \
      "Additional_Doses_18Plus", "Additional_Doses_65Plus", \
    ↪ "Second_Booster"]]]
covid_new.head(10)

```

```

[11]:
      Date Location  Distributed  Administered  Administered_5Plus  \
0  05/10/2023      NE      5481710      3822190      3793971.0
1  05/10/2023      LA      10282120      6961453      6945414.0
2  05/10/2023      GA      28727475      17124791      17045184.0
3  05/10/2023      WY       1281755       854132       851464.0
4  05/10/2023      CO      17769135      13033446      12899729.0
5  05/10/2023      PA      42895735      27586432      27360998.0
6  05/10/2023      DE       3352025       2169125       2157007.0
7  05/10/2023      OR      14222125       9399175       9326386.0
8  05/10/2023      WI      16474175      12444016      12347025.0
9  05/10/2023      ND       1910860       1314469       1302373.0

      Administered_12Plus  Administered_18Plus  Administered_65Plus  \
0              3647301              3412154              1117112
1              6796682              6443990              2090638
2             16545894             15542310              4409764
3              831727              790769              284622
4             12396074             11614071              3172390
5             26407167             24920539              8490730
6             2088591              1964981              709063
7             8983058              8453948              2698104
8             11929874             11264241              3948468
9             1253917              1185548              387008

      Administered_Moderna  Additional_Doses  Additional_Doses_5Plus  \
0              1240872              718168.0              716720.0
1              2685630             1110217.0             1110101.0
2              6170654             2705136.0             2703444.0
3              347522              145600.0              145579.0
4              4490965             2460212.0             2456349.0
5              9697012             4493396.0             4484903.0
6              747546              369899.0              369753.0
7              3129879             1812982.0             1811925.0
8              4216126             2432044.0             2429044.0
9              430115              219540.0              219501.0

      Additional_Doses_12Plus  Additional_Doses_18Plus  Additional_Doses_65Plus  \
0              699462.0              664415.0              240367.0
1             1103756.0             1076600.0             450792.0
2             2666367.0             2567417.0             892658.0
3             143988.0              139599.0              62044.0

```

4	2391387.0	2265625.0	662890.0
5	4394827.0	4213266.0	1683048.0
6	363440.0	347221.0	144617.0
7	1765406.0	1676283.0	582631.0
8	2374846.0	2270627.0	847457.0
9	214661.0	206044.0	81722.0

	Second_Booster
0	NaN
1	NaN
2	NaN
3	NaN
4	NaN
5	NaN
6	NaN
7	NaN
8	NaN
9	NaN

```
[12]: # step 3 drop unwanted rows for analysis on first doses
```

```
[13]: df_first = covid_new.dropna(subset=['Administered'])
df_first.shape
```

```
[13]: (38488, 15)
```

```
[14]: df_first.tail()
```

```
[14]:
```

	Date	Location	Distributed	Administered	Administered_5Plus	\
38483	12/13/2020	AS	3900	0	0.0	
38484	12/13/2020	VI	975	0	0.0	
38485	12/13/2020	MP	4875	0	0.0	
38486	12/13/2020	US	13650	0	0.0	
38487	12/13/2020	GU	3900	0	0.0	

	Administered_12Plus	Administered_18Plus	Administered_65Plus	\
38483	0	0	0	
38484	0	0	0	
38485	0	0	0	
38486	0	0	0	
38487	0	0	0	

	Administered_Moderna	Additional_Doses	Additional_Doses_5Plus	\
38483	0	NaN	NaN	
38484	0	NaN	NaN	
38485	0	NaN	NaN	
38486	0	NaN	NaN	

38487	0	NaN	NaN
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	Additional_Doses_12Plus	Additional_Doses_18Plus \
38483	NaN	0.0
38484	NaN	0.0
38485	NaN	0.0
38486	NaN	0.0
38487	NaN	0.0

	Additional_Doses_65Plus	Second_Booster
38483	0.0	NaN
38484	0.0	NaN
38485	0.0	NaN
38486	0.0	NaN
38487	0.0	NaN

```
[15]: df_first.columns.values
```

```
[15]: array(['Date', 'Location', 'Distributed', 'Administered',
        'Administered_5Plus', 'Administered_12Plus', 'Administered_18Plus',
        'Administered_65Plus', 'Administered_Moderna', 'Additional_Doses',
        'Additional_Doses_5Plus', 'Additional_Doses_12Plus',
        'Additional_Doses_18Plus', 'Additional_Doses_65Plus',
        'Second_Booster'], dtype=object)
```

```
[16]: df_first.isnull().sum().values
```

```
[16]: array([ 0, 0, 0, 0, 448, 0, 0, 0, 0,
        16348, 35544, 26456, 325, 325, 38385])
```

```
[17]: # step 4 remove fuzzy read strings in "location" column
```

```
[18]: df_first['Location'].unique()
```

```
[18]: array(['NE', 'LA', 'GA', 'WY', 'CO', 'PA', 'DE', 'OR', 'WI', 'ND', 'TX',
        'MN', 'UT', 'SC', 'DC', 'NC', 'WA', 'SD', 'PR', 'RI', 'IA', 'FM',
        'PW', 'NV', 'KY', 'VI', 'WV', 'VA2', 'ME', 'ID', 'BP2', 'MP', 'US',
        'IH2', 'MS', 'IL', 'KS', 'MH', 'FL', 'MO', 'GU', 'VT', 'CT', 'OH',
        'NJ', 'DD2', 'TN', 'CA', 'MT', 'IN', 'NY', 'AL', 'VA', 'MD', 'AR',
        'HI', 'OK', 'NH', 'AZ', 'MI', 'AS', 'AK', 'MA', 'NM', 'RP', 'LTC'],
        dtype=object)
```

```
[19]: states = ["AK", "AL", "AR", "AZ", "CA", "CO", "CT", "DE", "FL", "GA", "HI",
        ↪ "IA",
        "ID", "IL", "IN", "KS", "KY", "LA", "MA", "MD", "ME", "MI", "MN", "MO",
        "MS", "MT", "NC", "ND", "NE", "NH", "NJ", "NM", "NV", "NY", "OH", "OK",
        "OR", "PA", "RI", "SC", "SD", "TN", "TX", "UT", "VA", "VT", "WA", "WI",
        "WV", "WY", "DC", "AS", "GU", "MP", "PR", "VI"]
```

```
[20]: len(states)
```

```
[20]: 56
```

```
[21]: df_first1 = df_first[df_first['Location'].isin(states)]
```

```
[22]: df_first1.shape
```

```
[22]: (33436, 15)
```

```
[23]: # df_first1['Location'].unique()
```

```
[24]: # step 5 change header since the header about age is a bit confusing
```

```
[25]: df_first1 = df_first1.rename(columns={'Administered_5Plus':\
    ↪ 'Administered_5-12',\
    'Administered_12Plus':\
    ↪ 'Administered_12-18',\
    'Administered_18Plus':\
    ↪ 'Administered_18-65',\
    'Additional_Doses_5Plus':\
    ↪ 'Additional_Doses_5-12',\
    'Additional_Doses_12Plus':\
    ↪ 'Additional_Doses_12-18',\
    'Additional_Doses_18Plus':\
    ↪ 'Additional_Doses_18-65'})
```

```
[26]: df_first1.head(10)
```

```
[26]:
```

	Date	Location	Distributed	Administered	Administered_5-12 \
0	05/10/2023	NE	5481710	3822190	3793971.0
1	05/10/2023	LA	10282120	6961453	6945414.0
2	05/10/2023	GA	28727475	17124791	17045184.0
3	05/10/2023	WY	1281755	854132	851464.0
4	05/10/2023	CO	17769135	13033446	12899729.0
5	05/10/2023	PA	42895735	27586432	27360998.0
6	05/10/2023	DE	3352025	2169125	2157007.0
7	05/10/2023	OR	14222125	9399175	9326386.0
8	05/10/2023	WI	16474175	12444016	12347025.0
9	05/10/2023	ND	1910860	1314469	1302373.0

	Administered_12-18	Administered_18-65	Administered_65Plus \
0	3647301	3412154	1117112
1	6796682	6443990	2090638
2	16545894	15542310	4409764
3	831727	790769	284622
4	12396074	11614071	3172390

5	26407167	24920539	8490730
6	2088591	1964981	709063
7	8983058	8453948	2698104
8	11929874	11264241	3948468
9	1253917	1185548	387008

	Administered_Moderna	Additional_Doses	Additional_Doses_5-12 \
0	1240872	718168.0	716720.0
1	2685630	1110217.0	1110101.0
2	6170654	2705136.0	2703444.0
3	347522	145600.0	145579.0
4	4490965	2460212.0	2456349.0
5	9697012	4493396.0	4484903.0
6	747546	369899.0	369753.0
7	3129879	1812982.0	1811925.0
8	4216126	2432044.0	2429044.0
9	430115	219540.0	219501.0

	Additional_Doses_12-18	Additional_Doses_18-65	Additional_Doses_65Plus \
0	699462.0	664415.0	240367.0
1	1103756.0	1076600.0	450792.0
2	2666367.0	2567417.0	892658.0
3	143988.0	139599.0	62044.0
4	2391387.0	2265625.0	662890.0
5	4394827.0	4213266.0	1683048.0
6	363440.0	347221.0	144617.0
7	1765406.0	1676283.0	582631.0
8	2374846.0	2270627.0	847457.0
9	214661.0	206044.0	81722.0

	Second_Booster
0	NaN
1	NaN
2	NaN
3	NaN
4	NaN
5	NaN
6	NaN
7	NaN
8	NaN
9	NaN

```
[27]: # step 6 merge columns
```

```
[28]: # insert column for first doses for age 0-18
```



```
[29]: df_first1.insert(4, "Administered_0-18", df_first1['Administered_5-12'] +  
      ↪df_first1['Administered_12-18'])
```

```
[30]: df_first1.head(10)
```

```
[30]:
```

	Date	Location	Distributed	Administered	Administered_0-18	\
0	05/10/2023	NE	5481710	3822190	7441272.0	
1	05/10/2023	LA	10282120	6961453	13742096.0	
2	05/10/2023	GA	28727475	17124791	33591078.0	
3	05/10/2023	WY	1281755	854132	1683191.0	
4	05/10/2023	CO	17769135	13033446	25295803.0	
5	05/10/2023	PA	42895735	27586432	53768165.0	
6	05/10/2023	DE	3352025	2169125	4245598.0	
7	05/10/2023	OR	14222125	9399175	18309444.0	
8	05/10/2023	WI	16474175	12444016	24276899.0	
9	05/10/2023	ND	1910860	1314469	2556290.0	

	Administered_5-12	Administered_12-18	Administered_18-65	\
0	3793971.0	3647301	3412154	
1	6945414.0	6796682	6443990	
2	17045184.0	16545894	15542310	
3	851464.0	831727	790769	
4	12899729.0	12396074	11614071	
5	27360998.0	26407167	24920539	
6	2157007.0	2088591	1964981	
7	9326386.0	8983058	8453948	
8	12347025.0	11929874	11264241	
9	1302373.0	1253917	1185548	

	Administered_65Plus	Administered_Moderna	Additional_Doses	\
0	1117112	1240872	718168.0	
1	2090638	2685630	1110217.0	
2	4409764	6170654	2705136.0	
3	284622	347522	145600.0	
4	3172390	4490965	2460212.0	
5	8490730	9697012	4493396.0	
6	709063	747546	369899.0	
7	2698104	3129879	1812982.0	
8	3948468	4216126	2432044.0	
9	387008	430115	219540.0	

	Additional_Doses_5-12	Additional_Doses_12-18	Additional_Doses_18-65	\
0	716720.0	699462.0	664415.0	
1	1110101.0	1103756.0	1076600.0	
2	2703444.0	2666367.0	2567417.0	
3	145579.0	143988.0	139599.0	
4	2456349.0	2391387.0	2265625.0	

5	4484903.0	4394827.0	4213266.0
6	369753.0	363440.0	347221.0
7	1811925.0	1765406.0	1676283.0
8	2429044.0	2374846.0	2270627.0
9	219501.0	214661.0	206044.0

	Additional_Doses_65Plus	Second_Booster
0	240367.0	NaN
1	450792.0	NaN
2	892658.0	NaN
3	62044.0	NaN
4	662890.0	NaN
5	1683048.0	NaN
6	144617.0	NaN
7	582631.0	NaN
8	847457.0	NaN
9	81722.0	NaN

```
[31]: # insert column for addition doses for age 0-18
```

```
[32]: df_first1.insert(11, "Additional_Doses_0-18",
↳df_first1['Additional_Doses_5-12'] + df_first1['Additional_Doses_12-18'])
```

```
[33]: # drop unnecessary columns
```

```
[34]: df_first1 = df_first1.drop(columns=['Administered_5-12', 'Administered_12-18',
↳'Additional_Doses_5-12', 'Additional_Doses_12-18'])
```

```
[35]: df_first1
```

```
[35]:
```

	Date	Location	Distributed	Administered	Administered_0-18	\
0	05/10/2023	NE	5481710	3822190	7441272.0	
1	05/10/2023	LA	10282120	6961453	13742096.0	
2	05/10/2023	GA	28727475	17124791	33591078.0	
3	05/10/2023	WY	1281755	854132	1683191.0	
4	05/10/2023	CO	17769135	13033446	25295803.0	
...	
38481	12/14/2020	MA	5850	0	0.0	
38483	12/13/2020	AS	3900	0	0.0	
38484	12/13/2020	VI	975	0	0.0	
38485	12/13/2020	MP	4875	0	0.0	
38487	12/13/2020	GU	3900	0	0.0	

	Administered_18-65	Administered_65Plus	Administered_Moderna	\
0	3412154	1117112	1240872	
1	6443990	2090638	2685630	
2	15542310	4409764	6170654	

3	790769	284622	347522
4	11614071	3172390	4490965
...
38481	0	0	0
38483	0	0	0
38484	0	0	0
38485	0	0	0
38487	0	0	0

	Additional_Doses	Additional_Doses_0-18	Additional_Doses_18-65 \
0	718168.0	1416182.0	664415.0
1	1110217.0	2213857.0	1076600.0
2	2705136.0	5369811.0	2567417.0
3	145600.0	289567.0	139599.0
4	2460212.0	4847736.0	2265625.0
...
38481	NaN	NaN	0.0
38483	NaN	NaN	0.0
38484	NaN	NaN	0.0
38485	NaN	NaN	0.0
38487	NaN	NaN	0.0

	Additional_Doses_65Plus	Second_Booster
0	240367.0	NaN
1	450792.0	NaN
2	892658.0	NaN
3	62044.0	NaN
4	662890.0	NaN
...
38481	0.0	NaN
38483	0.0	NaN
38484	0.0	NaN
38485	0.0	NaN
38487	0.0	NaN

[33436 rows x 13 columns]

```
[36]: df_first1.tail()
```

```
[36]:
```

	Date	Location	Distributed	Administered	Administered_0-18 \
38481	12/14/2020	MA	5850	0	0.0
38483	12/13/2020	AS	3900	0	0.0
38484	12/13/2020	VI	975	0	0.0
38485	12/13/2020	MP	4875	0	0.0
38487	12/13/2020	GU	3900	0	0.0

Administered_18-65	Administered_65Plus	Administered_Moderna \
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38481	0	0	0
38483	0	0	0
38484	0	0	0
38485	0	0	0
38487	0	0	0

	Additional_Doses	Additional_Doses_0-18	Additional_Doses_18-65 \
38481	NaN	NaN	0.0
38483	NaN	NaN	0.0
38484	NaN	NaN	0.0
38485	NaN	NaN	0.0
38487	NaN	NaN	0.0

	Additional_Doses_65Plus	Second_Booster
38481	0.0	NaN
38483	0.0	NaN
38484	0.0	NaN
38485	0.0	NaN
38487	0.0	NaN

```
[37]: # drop unnecessary rows
```

```
[38]: df_second = df_first1.dropna(subset=['Additional_Doses'])
df_second.shape
```

```
[38]: (19320, 13)
```

Several edits and reorganization of the data has been made to the raw data file. First of all, I checked if there is null values in the dataframe, and select the columns I want to use with my analysis from 109 columns; a few data column names has been revised to avoid ambiguity; new column is created to sum up two groups into one to align with other data sources; Lastly I dropped some datasets that has no values in 'Additional_Dose' column to form a dataframe mainly focus on second dose for future analysis.

This COVID-19 vaccination data is directly shared by CDC to the public domain, so it's from a highly creditable source. Apparently further handling of the data will follow guidelines and recommendations of COVID-19 vaccination, including data reporting requirements for healthcare providers and public health agencies. Also, we must adhere to data security standards to protect against unauthorized access, use, or disclosure of sensitive information.

The data transformation targets for creating more clear demonstration of the information, with most relevant aspects maintained. The transformation enables a better alignment between this data frame with other data sources. The only one assumption being made in this transformation is about the age groups, we expect the number of infants(kids under 5 years old) who takes COVID-19 vaccination is for the most part small enough compared with other ages groups, so that when we created the new "additional_Doses_0-18" column, we added up the 5Plus (5-12 years old) and 12 Plus (12-18 years old) column and expected it will be substantially representing the the 0-18 age group.

However we still missing the information about vaccination for age group under 5 in our 0-18 age group. That might lead to the inaccuracy of the analysis. It wouldn't be a big problem, as we all have known that the group that had the vaccination under age 5 are slight small, that might make a big difference in the data analysis process. No assumption was made during my data cleaning process, I would like to see some amazing results in the next analysis steps.

```
[39]: file_path = "df_first1.csv"
      df_first1.to_csv(file_path, index=False)
```

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