#### Vaccines Given to Patients Under 19 Years Old in 2021

-This Notebook was created using bulk Healthcare Data regarding vaccines given that has had all PHI (Protected Health Information) removed. This data was sourced from a SQL Server using a SQL query (that will be commented below) and exported into an Excel file to then have all PHI removed. The file was then saved as a CSV file for import and use in this Python Jupyter Notebook-

### **SQL Query**

SELECT DISTINCT e3\_Vaccines\_Administered.Imm\_Pat\_ID, e3\_Vaccines\_Administered.Imm\_Pat

e1\_Master\_Patients.e1Pri\_Ins\_Grp, e3\_Vaccines\_Administered.Ins\_Group, e3\_Vaccines\_Administered.Ins\_CHIP,

(Int(DateDiff("d",e1\_Master\_Patients.e1Pat\_DOB,e3\_Vaccines\_Administered.Imm\_GivenDate)/365)) AS Age\_at\_Imm\_GivenDate, e3\_Vaccines\_Administered.Pat\_DOB,e3\_Vaccines\_Ad

- e3\_Vaccines\_Administered.Age\_Group, e3\_Vaccines\_Administered.Enc\_Date, e3\_Vaccines\_Administered.Enc\_Date\_YYMM, e3\_Vaccines\_Administered.Enc\_Date
- e3 Vaccines Administered.Imm ItemID, e3 Vaccines Administered.Imm Item Name, e3 Vaccines Administered.Imm VFC AOV, e3 Vaccines Administered.Imm VFC AOV Reclass,
- e3\_Vaccines\_Administered.Imm\_VFC\_Report\_Column, e3\_Vaccines\_Administered.Imm\_USIIS\_Desc, e3\_Vaccines\_Administered.Imm\_GivenDate, e3\_Vaccines\_Administered.Imm\_GivenDate, "YYMM, Format(e3\_Vaccines\_Administered.Imm\_GivenDate," yyyy") & "/Q" & Format(e3\_Vaccines\_Administered.Imm\_GivenDate," y) AS Quarter,
- e3\_Vaccines\_Administered.Given\_Date\_Seen\_by\_CHC, e3\_Vaccines\_Administered.Given\_by\_CHC derived, e3\_Vaccines\_Administered.Imm\_LotID, e3\_Vac
- $e3\_Vaccines\_Administered.Imm\_Dose, e3\_Vaccines\_Administered.Imm\_Dose, e3\_Vaccines\_Administered.Imm\_Facility, e3\_Vaccines\_Administered$
- $e3\_Vaccines\_Administered.Imm\_CPTcvx, e3\_Vaccines\_Administered.Imm\_LocineName, e3\_VaccineS\_Administered.Imm\_LocineName$
- e3\_Vaccines\_Administered.Imm\_VFC\_Code, e3\_Vaccines\_Administered.Imm\_Action, e3\_Vaccines\_Administered.Imm\_decDoses, e3\_Vaccines\_Administered.Imm\_Route,
- e3\_Vaccines\_Administered.QA\_Facility\_Match, e3\_Vaccines\_Administered.QA\_Lot\_Number\_Match, e3\_Vaccines\_Administered.Units, e3\_Vaccines\_Administered.Vaccine\_Billed\_on\_Claim,
- $e3\_Vaccines\_Administered.Vaccine\_Billed\_Amount INTO (Vax\_Admin\_Prt1 \ for \ 2021 \ no \ PHI) FROM \ e3\_Vaccines\_Administered \ LEFT \ JOIN \ e1\_Master\_Patients \ ON \ e1\_Master\_Patients \ ON \ e1\_Master\_Patients \ e1\_$
- $(e3\_Vaccines\_Administered.Imm\_Pat\_ID2 = e1\_Master \textit{Patients.e1Pat#}\_2) \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_Pat\_ID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_PatID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccines\_Administered.Imm\_PatID = e1\_Master \textit{Patients.e1Pat#}) \ WHERE \ AND \ (e3\_Vaccine$
- e3\_Vaccines\_Administered.Imm\_Given\_Date\_YYMM > '2020/12' AND e3\_Vaccines\_Administered.Imm\_Given\_Date\_YYMM < '2022/01';

#### Import Data, Packages and Libraries Needed

|         | Import Data, Factory and Electrical records |                           |  |             |              |              |              |                  |                 |               |                 |              |                |       |
|---------|---|---------------------------|--|-------------|--------------|--------------|--------------|------------------|-----------------|---------------|-----------------|--------------|----------------|-------|
| In [1]: |   | t numpy as<br>t pandas as |  |             |              |              |              |                  |                 |               |                 |              |                |       |
| In [2]: |   |                           | ate DataFrame from<br>ad_csv('Vax_Admin_ |             | 21 no PHI.cs | v')          |              |                  |                 |               |                 |              |                |       |
| In [3]: |   | ualize top<br>ata.head()  | 5 Rows to make sur                       | re data was | imported cor | rectly       |              |                  |                 |               |                 |              |                |       |
| Out[3]: | lm  | munizationId              | e1MasterPatients_ID                      | Imm_Pat_ID  | Imm_Pat_ID2  | Immun_Enc_ID | Enc_Claim_ID | Enc_ClaimID_is_0 | Claim_Ins_Group | e1Pri_Ins_Grp | Ins_Group       | Imm_Cvx_Code | Imm_VFC_Code I | imm_i |
|         | 0   | 406327                    | 131207                                   | 1074560     | 1074560      | 3494445      | 1723886.0    | N                | 1)Self Pay      | 9)Private Ins | Non-<br>Insured | 150          | V07            |       |
|         | 1   | 406328                    | 209653                                   | 1051974     | 1051974      | 3632143      | 1724411.0    | N                | 9)Private Ins   | 9)Private Ins | Insured         | 130          | V01            |       |
|         | 2   | 406329                    | 209653                                   | 1051974     | 1051974      | 3632143      | 1724411.0    | N                | 9)Private Ins   | 9)Private Ins | Insured         | 94           | V01            |       |
|         | 3   | 406330                    | 160779                                   | 1127359     | 1127359      | 3605232      | 1723957.0    | N                | 3)Mcaid HMO     | 3)Mcaid HMO   | Medicaid        | 133          | V02            |       |
|         | 4   | 406331                    | 219842                                   | 1124666     | 1124666      | 3649693      | 1723909.0    | N                | 3)Mcaid HMO     | 3)Mcaid HMO   | Medicaid        | 48           | V02            |       |
|         | 5 rows                                      | × 47 column               | S  |             |              |              |              |                  |                 |               |                 |              |                |       |
| 4       |   |                           |  |             |              |              |              |                  |                 |               |                 |              |                | •     |
| In [4]: |   | lore data, ;              | find out how many                        | missing val | ues, etc     |              |              |                  |                 |               |                 |              |                |       |

```
<class 'pandas.core.frame.DataFrame
RangeIndex: 64673 entries, 0 to 64672
Data columns (total 47 columns):
                                Non-Null Count Dtype
     Column
а
     ImmunizationId
                                64673 non-null int64
     e1MasterPatients TD
                                64673 non-null int64
     Imm_Pat_ID
                                 64673 non-null int64
     Imm Pat ID2
                                64673 non-null
                                                  object
     Immun_Enc_ID
                                 64673 non-null
     Enc_Claim_ID
                                52755 non-null float64
     Enc_ClaimID_is_0
                                 64673 non-null object
     Claim_Ins_Group
e1Pri_Ins_Grp
                                 52503 non-null
                                                  object
                                 39233 non-null
                                                  object
     Ins_Group
                                 64673 non-null
                                                  object
 10 Ins_CHIP
                                 64673 non-null object
     Age_at_Imm_GivenDate
Pat_Older_19
                                                 int64
object
                                 64673 non-null
 11
12
                                 64673 non-null
 13
     Age_Group
                                 64673 non-null object
 14
     Enc Date
                                 52755 non-null object
 15
     Enc_Date_YYMM
                                 52755 non-null
                                                  object
     Enc_Service_Location
                                52755 non-null object
 16
     Imm_ItemID
                                 64673 non-null int64
 17
     Imm_Item_Name
Imm_VFC_AOV
 18
                                 64672 non-null object
                                 64673 non-null
 19
                                                  object
 20
     Imm_VFC_AOV_Reclass
                                 64673 non-null object
     Imm_VFC_Report_Column
 21
                                 31755 non-null object
     Imm_USIIS_Desc
Imm_GivenDate
                                31990 non-null object
64673 non-null object
 22
 23
24
     Imm_Given_Date_YYMM
                                 64673 non-null object
                                 64673 non-null object
 25
     Ouarter
 26
     Given_Date_Seen_by_CHC
                                64673 non-null
 27
     Given_by_CHC_derived
                                62504 non-null
                                                  obiect
 28
     Imm_LotID
                                 53872 non-null float64
 29
     Imm LotNumber
                                 62465 non-null object
                                 64473 non-null
     Imm_Dose
                                                  object
     Imm_VaccineManufacturer
Imm_Facility
 31
                                62227 non-null object
                                 63481 non-null object
 33
     e1Service_Location
                                52742 non-null object
64661 non-null object
     Imm_CPTcvx
     Imm_VaccineName
Imm_Mvx_Code
                                64661 non-null object
49548 non-null object
 35
 37
     Imm_Cvx_Code
                                64647 non-null object
                                51897 non-null
 38
     Imm_VFC_Code
Imm_Action
                                                  object
 39
                                 53872 non-null object
                                64673 non-null int64
 40
     Imm decDoses
                                 51929 non-null
 41
                                                  object
     OA Facility Match
 42
                                64673 non-null
                                                  object
 43
     QA_Lot_Number_Match
                                 64673 non-null
                                                  object
 44 Units
                                64673 non-null int64
     Vaccine_Billed_on_Claim
                                64673 non-null
                                                  object
46 Vaccine Billed Amount 31265 non-1
dtypes: float64(2), int64(8), object(37)
memory usage: 23.2+ MB
                                31265 non-null object
```

In [5]: # Lets see summary statistics
 vax\_data.describe()

| : |       | ImmunizationId | e1MasterPatients_ID | Imm_Pat_ID   | Immun_Enc_ID | Enc_Claim_ID | Age_at_Imm_GivenDate | Imm_ItemID    | Imm_LotID    | Imm_decDoses | Units   |
|---|-------|----------------|---------------------|--------------|--------------|--------------|----------------------|---------------|--------------|--------------|---------|
|   | count | 64673.000000   | 64673.000000        | 6.467300e+04 | 6.467300e+04 | 5.275500e+04 | 64673.000000         | 64673.000000  | 53872.000000 | 64673.000000 | 64673.0 |
|   | mean  | 440424.877801  | 144379.688015       | 8.826000e+05 | 3.118431e+06 | 1.807008e+06 | 24.870255            | 401630.093146 | 8178.246325  | 0.982821     | 1.0     |
|   | std   | 19879.515334   | 64219.848012        | 3.887205e+05 | 1.486026e+06 | 1.214959e+05 | 24.189748            | 99686.393255  | 1694.057132  | 0.129938     | 0.0     |
|   | min   | 406327.000000  | 77.000000           | 1.665260e+05 | 0.000000e+00 | 0.000000e+00 | 0.000000             | -1.000000     | 0.000000     | 0.000000     | 1.0     |
|   | 25%   | 423324.000000  | 94394.000000        | 1.001715e+06 | 3.657480e+06 | 1.767370e+06 | 1.000000             | 282408.000000 | 8162.000000  | 1.000000     | 1.0     |
|   | 50%   | 440323.000000  | 161790.000000       | 1.093289e+06 | 3.779761e+06 | 1.819274e+06 | 17.000000            | 443622.000000 | 8471.000000  | 1.000000     | 1.0     |
|   | 75%   | 457133.000000  | 198897.000000       | 1.134199e+06 | 3.910336e+06 | 1.858228e+06 | 46.000000            | 493969.000000 | 8873.000000  | 1.000000     | 1.0     |
|   | max   | 506722.000000  | 228556.000000       | 1.153654e+06 | 4.026727e+06 | 1.908845e+06 | 96.000000            | 503393.000000 | 9266.000000  | 1.000000     | 1.0     |
|   |       |                |                     |              |              |              |                      |               |              |              |         |

\*interesting to see the youngest person to receive a vaccine was 0 and the oldest was 96 with the average age being almmost 25 (24.87)

```
In [6]: # we will be comparing the field 'Vaccine_Billed_Amount' later and thus need to change from $ currency to
# just a float without the dollar sign or any commas

vax_data['Vaccine_Billed_Amount'] = vax_data['Vaccine_Billed_Amount'].str.replace(',','')
vax_data['Vaccine_Billed_Amount'] = vax_data['Vaccine_Billed_Amount'].str.replace('$','')
vax_data['Vaccine_Billed_Amount'] = vax_data['Vaccine_Billed_Amount'].astype(float)
```

C:\Users\cflink\AppData\Local\Temp\ipykernel\_21008\814292187.py:5: FutureWarning: The default value of regex will change from True to False in a future version. In additi on, single character regular expressions will \*not\* be treated as literal strings when regex=True.

vax data['Vaccine Billed Amount'] = vax data['Vaccine Billed Amount'].str.replace('\$','')

#### Find out if we have any duplicates

```
In [7]: duplicate_vax = vax_data[vax_data.duplicated('ImmunizationId')]
print("Duplicate Rows based on ImmunizationId :")
duplicate_vax
```

Duplicate Rows based on ImmunizationId :

| Out[7]: |         | ImmunizationId  | e1MasterPatients_ID | Imm_Pat_ID | Imm_Pat_ID2 | Immun_Enc_ID | Enc_Claim_ID | Enc_ClaimID_is_0 | Claim_Ins_Group | e1Pri_Ins_Grp | Ins_Group       | Imm_Cvx_Code | Imm_VFC_Code    |
|---------|---------|-----------------|---------------------|------------|-------------|--------------|--------------|------------------|-----------------|---------------|-----------------|--------------|-----------------|
|         | 1190    | 407619          | 201168              | 227597     | 21535.1     | 3648090      | 1727893.0    | N                | 3)Mcaid HMO     | 3)Mcaid HMO   | Medicaid        | 158          | VO              |
|         | 1388    | 407825          | 49192               | 222628     | 188329.4    | 3663592      | 1728455.0    | N                | 1)Self Pay      | 2)Medicaid    | Non-<br>Insured | 150          | V0 <sup>-</sup> |
|         | 1866    | 408332          | 207264              | 1131306    | 1131306     | 3641511      | 1730083.0    | N                | 1)Self Pay      | 9)Private Ins | Non-<br>Insured | 150          | V0:             |
|         | 3427    | 409979          | 171156              | 1117083    | 1117083     | 3672280      | 1736565.0    | N                | 3)Mcaid HMO     | 3)Mcaid HMO   | Medicaid        | 83           | VO;             |
|         | 4803    | 411475          | 49192               | 222628     | 188329.4    | 3666779      | 1741511.0    | N                | 1)Self Pay      | 2)Medicaid    | Non-<br>Insured | 115          | V0·             |
|         |         |                 |                     |            |             |              |              |                  |                 |               |                 |              |                 |
|         | 61268   | 470239          | 13474               | 183394     | 183785      | 4012892      | 1887081.0    | N                | 6)Medicare      | 6)Medicare    | Insured         | 207          | V0·             |
|         | 61269   | 470239          | 13475               | 183394     | 183785      | 4012892      | 1887081.0    | N                | 6)Medicare      | 6)Medicare    | Insured         | 207          | V0·             |
|         | 63326   | 474430          | 101849              | 237495     | 37571.1     | 0            | NaN          | N                | NaN             | 3)Mcaid HMO   | Medicaid        | 208          | Nah             |
|         | 63328   | 474431          | 101849              | 237495     | 37571.1     | 0            | NaN          | N                | NaN             | 3)Mcaid HMO   | Medicaid        | 208          | Nañ             |
|         | 63365   | 474986          | 165643              | 1133164    | 1133164     | 0            | NaN          | N                | NaN             | 3)Mcaid HMO   | Medicaid        | 207          | Naħ             |
| 1       | 135 rov | vs × 47 columns |                     |            |             |              |              |                  |                 |               |                 |              |                 |
|         |         |                 |                     |            |             |              |              |                  |                 |               |                 |              |                 |

## **Drop Duplicates**

0 rows × 47 columns

4

```
In [8]: vax_data.drop_duplicates(subset=['ImmunizationId'], keep='first', inplace=True)
# dropped dups and saved df 'inplace' instead of a new df, check df.info to see how many rows were dropped
# df had 64673 entries to begin with, we found there to be 135 duplicates, after dropping those we ended up with 135 less
           # entries at a total of 64538
          vax_data.info()
          <class 'pandas.core.frame.DataFrame'>
          Int64Index: 64538 entries, 0 to 64672
          Data columns (total 47 columns):
           # Column
                                               Non-Null Count Dtype
                ImmunizationId
e1MasterPatients_ID
                                               64538 non-null
                                               64538 non-null
                                                                   int64
                Imm_Pat_ID
                                               64538 non-null
                                               64538 non-null
                Imm Pat ID2
                                                                   object
                Immun_Enc_ID
                                               64538 non-null
                Enc_Claim_ID
                                               52650 non-null
                                                                   float64
                Enc_ClaimID_is_0
                                               64538 non-null
                                                                   object
                Claim Ins Group
                                               52398 non-null
                                                                   object
                                                39099 non-null
                e1Pri_Ins_Grp
                                                                   object
                Ins_Group
Ins_CHIP
                                               64538 non-null
                                                                   object
                                               64538 non-null
           10
                                                                   object
           11
                Age_at_Imm_GivenDate
Pat_Older_19
                                               64538 non-null
64538 non-null
                                                                   int64
           12
                                                                   object
           13
                Age_Group
                                               64538 non-null
                                                                   object
           14
                Enc Date
                                               52650 non-null
                                                                   object
           15
                Enc_Date_YYMM
                                                52650 non-null
                Enc_Service_Location
Imm_ItemID
           16
                                               52650 non-null
                                                                   object
           17
                                               64538 non-null
                                                                  int64
                Imm_Item_Name
Imm_VFC_AOV
Imm_VFC_AOV_Reclass
Imm_VFC_Report_Column
           18
                                               64537 non-null
                                                                   object
                                                64538 non-null
                                                                   object
            19
           20
                                               64538 non-null
                                                                   object
           21
                                               31705 non-null
                                                                   object
                Imm_USIIS_Desc
Imm_GivenDate
                                               31940 non-null object
64538 non-null object
           22
           23
                Imm_Given_Date_YYMM
Quarter
                                               64538 non-null
64538 non-null
                                                                  object
object
           24
            25
           26
                Given_Date_Seen_by_CHC
                                               64538 non-null
                                                                   object
                Given_by_CHC_derived
Imm_LotID
           27
                                               62377 non-null
                                                                   obiect
           28
                                               53762 non-null
                                                                   float64
           29
                Imm LotNumber
                                               62338 non-null
                                                                   object
                Imm_Dose
                                               64338 non-null
                                                                   object
                Imm_VaccineManufacturer
Imm_Facility
           31
                                               62100 non-null
                                                                   object
                                               63351 non-null
                e1Service Location
                                               52637 non-null
           33
                                                                   object
                Imm_CPTcvx
                                               64526 non-null
                                                                  object
            35
36
                Imm_VaccineName
Imm_Mvx_Code
                                               64526 non-null
                                                                  object
object
                                               49450 non-null
           37
                Imm_Cvx_Code
                                               64512 non-null object
                Imm_VFC_Code
Imm_Action
Imm_decDoses
                                               51791 non-null
            38
                                                                   object
            39
                                               53762 non-null
                                                                  object
int64
           40
                                               64538 non-null
           41
                Imm Route
                                               51823 non-null
                                                                   object
                OA Facility Match
           42
                                               64538 non-null
                                                                  object
           43
                QA_Lot_Number_Match
                                               64538 non-null
                                               64538 non-null
                                                                   int64
           44
                Units
           45
                Vaccine_Billed_on_Claim
                                               64538 non-null
          46 Vaccine_Billed_Amount 31215 non-dtypes: float64(3), int64(8), object(36)
                                               31215 non-null float64
          memory usage: 23.6+ MB
In [9]: # Lets see if there are any duplicates now
duplicate_vax2 = vax_data[vax_data.duplicated('ImmunizationId')]
          print("Duplicate Rows based on ImmunizationId :")
          Duplicate Rows based on ImmunizationId :
Out[9]: ImmunizationId e1MasterPatients_ID Imm_Pat_ID Imm_Pat_ID2 Immun_Enc_ID Enc_Claim_ID Enc_ClaimID_is_0 Claim_Ins_Group e1Pri_Ins_Group ins_Group ... Imm_Cvx_Code Imm_VFC_Code Imm_A
```

looks like we removed all the duplicate rows based on 'ImmunizationId' which was the primary key in the database we pulled from

#### Remove Non-Vaccine Injections and Vaccines Not Given by Organization

create a couple of lists

one with all non-vaccine injections & one with locations that are part of organization when 'Enc\_Claim\_ID' is NaN

#### Missing Values

Some of the missing values are needed to analyze the data properly and filter for our needs

```
In [13]: # Claim Ins Group & e1Pri Ins Grp have 'null' values that need to be imputed from the other fields
               vax_data['e1Pri_Ins_Grp'] = np.where((vax_data['e1Pri_Ins_Grp'].isna()))
                                                                         (vax_data['Claim_Ins_Group'].isna()) &
  (vax_data['Ins_Group'] == 'Non-Insured'), '1)Self Pay', vax_data['e1Pri_Ins_Grp'])
               vax_data['Claim_Ins_Group'] = np.where((vax_data['Claim_Ins_Group'].isna()),
                                                                            vax_data['e1Pri_Ins_Grp'], vax_data['Claim_Ins_Group'])
               vax_data['e1Pri_Ins_Grp'] = np.where((vax_data['e1Pri_Ins_Grp'].isna()),
                                                                             vax_data['Claim_Ins_Group'], vax_data['e1Pri_Ins_Grp'])
In [14]: # 'Imm_VFC_Report_Column' & 'Imm_USIIS_Desc' have 'null'/missing values that need to be filled in
              # This data is all categorized by 'Imm_ItemID' field, which has a reference table that I will import.
# Then we can join the two tables and fill the missing values
               vax_ref_data = pd.read_csv('Vax_ref_Imm_table.csv')
               vax_data = vax_data.merge(vax_ref_data, how='left')
              # drop the columns that are replaced with 'm1VFC_Report_Column' & 'USIIS_Desc' from the reference table vax_data = vax_data.drop(['Imm_VFC_Report_Column', 'Imm_USIIS_Desc'], axis=1)
In [15]: # reorder columns to put 'm1VFC_Report_Column' & 'USIIS_Desc' where 'Imm_VFC_Report_Column' & 'Imm_USIIS_Desc' where
               # and place the new 'VFC/AOV' column next to the columns with similar data for comparison sake
               vax_data = vax_data[['ImmunizationId','e1MasterPatients_ID','Imm_Pat_ID','Imm_Pat_ID2','Immun_Enc_ID',
                'Enc Claim ID', 'Enc Claim ID is 0', 'Claim Ins_Group', 'elPri_Ins_Gry', 'Ing_Group', 'Ins_CHIP', 'Age_at_Imm_GivenDate',

'Pat_Older_19', 'Age_Group', 'Enc_Date', 'Enc_Date_YYMM', 'Enc_Service_Location', 'Imm_ItemID', 'Imm_Item_Name',

'Imm_VFC_AOV', 'Imm_VFC_AOV_Reclass', 'VFC/AOV', 'miVFC_Report_Column', 'USIIS_Desc', 'Imm_GivenDate', 'Imm_Given_Date_YYMM',

'Quarter', 'Given_Date_Seen_by_CHC', 'Given_by_CHC_derived', 'Imm_LotID', 'Imm_LotNumber', 'Imm_Dose',

'Imm_VaccineManufacturer', 'Imm_Facility', 'elService_Location', 'Imm_CPTcvx', 'Imm_VaccineName', 'Imm_Mvx_Code',

'Imm_Cvx_Code', 'Imm_VFC_Code', 'Imm_Action', 'Imm_decDoses', 'Imm_Route', 'QA_Facility_Match', 'QA_Lot_Number_Match',
                 'Units','Vaccine_Billed_on_Claim','Vaccine_Billed_Amount']]
In [16]: # reset index after multiple changes
vax_data = vax_data.reset_index(drop=True)
```

#### Last Step - Update 'Imm\_VFC\_AOV\_Reclass' Column

when a vaccine was given to a child (less than 19) but was billed it is not considered "VFC" but "AOV"

```
In [17]: # Lets use a for loop with some if statements

for i in vax_data.index:
    if vax_data.at[i, 'Age_at_Imm_GivenDate'] > 19:
        vax_data.at[i, 'Imm_VFC_AOV_Reclass'] = 'AOV'
    else:
        if vax_data.at[i, 'Vaccine_Billed_Amount'] == 0:
            vax_data.at[i, 'Imm_VFC_AOV_Reclass'] = 'VFC'
        elif vax_data.at[i, 'Vaccine_Billed_Amount'] > 0:
            vax_data.at[i, 'Imm_VFC_AOV_Reclass'] = 'AOV'
    else:
        vax_data.at[i, 'Imm_VFC_AOV_Reclass'] = vax_data.at[i, 'Imm_VFC_AOV']
```

# Answering the Question: How Many Vaccines Were Given to Patients Under 19 Years Old in 2021

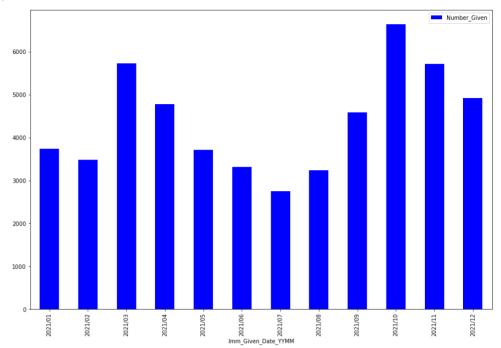
```
In [18]: vax_given_under19 = len(vax_data[vax_data['Age_at_Imm_GivenDate'] < 19])
print("There were " + str(vax_given_under19) + " vaccines given to patients under 19 years old in 2021.")
There were 31899 vaccines given to patients under 19 years old in 2021.</pre>
```

#### Lets Visualize Some of this Data

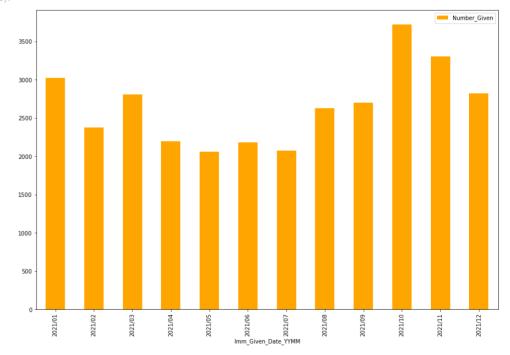
```
In [19]: month_occ = vax_data.groupby(['Imm_Given_Date_YYMM']).count()
```

```
month_occ = month_occ.reset_index()
month_occ = month_occ[['Imm_Given_Date_YYMM', 'ImmunizationId']]
month_occ.columns = ['Imm_Given_Date_YYMM', 'Number_Given']
month_occ_plot = month_occ.plot.bar(x='Imm_Given_Date_YYMM', y='Number_Given', color = 'blue', figsize = (15,10))
month_occ_plot
```

Out[19]. <AxesSubplot:xlabel='Imm\_Given\_Date\_YYMM'>



Out[20]: <AxesSubplot:xlabel='Imm\_Given\_Date\_YYMM'>



Out[21]: <AxesSubplot:xlabel='Imm\_Given\_Date\_YYMM'>

