Covid-19 Vaccination Campaign in Germany

The data used here were provided by Robert Koch Institute and the German federal ministry of Health.

These institutions publish the datasets and some analysis on the page impfdashboard.de.

Setup

Imports

```
In [1]: # standard library
import datetime
import math

In [2]: # third party
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import requests
import seaborn
```

Date this Notebook was run

```
In [3]: today = datetime.datetime.today().strftime('%Y-%m-%d')
today
Out[3]: '2021-10-06'
```

Set Defaults

```
In [4]: # style like ggplot in R
plt.style.use('ggplot')

In [5]: # Avoid cutting off part of the axis labels, see:
    # https://stackoverflow.com/questions/6774086/why-is-my-xlabel-cut-off-in-my-matplotlib-plot
    plt.rcParams.update({'figure.autolayout': True})
```

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```
In [6]: | population_germany = 83_200_000
```

Get and Transform Data

```
In [7]: vaccination_data_permalink = 'https://impfdashboard.de/static/data/germany_vaccinations_timeseries_v2.tsv'
vaccinations = pd.read_csv(
    vaccination_data_permalink,
    sep="\t")
```

Drop unnecessary / misleading columns

List all columns:

```
vaccinations.columns
In [8]:
        Index(['date', 'dosen kumulativ', 'dosen biontech kumulativ',
Out[8]:
                'dosen biontech erst kumulativ', 'dosen biontech zweit kumulativ',
               'dosen biontech dritt kumulativ', 'dosen moderna kumulativ',
               'dosen moderna erst kumulativ', 'dosen moderna zweit kumulativ',
               'dosen moderna dritt kumulativ', 'dosen astra kumulativ',
               'dosen_astra_erst_kumulativ', 'dosen astra zweit kumulativ',
               'dosen astra dritt kumulativ', 'dosen johnson kumulativ',
               'dosen erst kumulativ', 'dosen zweit kumulativ',
               'dosen dritt kumulativ', 'dosen differenz zum vortag',
               'dosen erst differenz zum vortag', 'dosen zweit differenz zum vortag',
               'dosen dritt differenz zum vortag', 'personen erst kumulativ',
               'personen voll kumulativ', 'personen auffrisch kumulativ',
               'impf quote erst', 'impf quote voll', 'dosen dim kumulativ',
               'dosen kbv kumulativ', 'indikation alter dosen',
               'indikation beruf dosen', 'indikation medizinisch dosen',
               'indikation pflegeheim dosen', 'indikation alter erst',
               'indikation beruf erst', 'indikation medizinisch erst',
               'indikation pflegeheim erst', 'indikation alter voll',
               'indikation beruf voll', 'indikation medizinisch voll',
               'indikation pflegeheim voll'],
              dtype='object')
```

Columns with names starting with 'indikation_' will not be analyzed as the data providers stopped updating them.

```
In [9]: cols_to_drop = vaccinations.columns[vaccinations.columns.str.contains('indikation_')]
vaccinations.drop(columns=cols_to_drop, inplace=True)
```

Some more columns can be dropped, as there is no interest in analyzing differences on a vaccine level - especially since in some cases vaccines

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were mixed.

Some columns are labeled misleadingly. As stated by the data provider the columns personen_erst_kumulativ and impf_quote_erst contain people vaccinated with the Johnson & Johnson vaccine. As this requires only one shot, the same persons are included in personen voll kumulativ. Therefore more columns are dropped and recalculated later.

```
In [11]: vaccinations.drop(columns=['impf_quote_erst', 'impf_quote_voll'], inplace=True)
```

Convert datatype of date column

```
In [12]: vaccinations.iloc[ : , [0]] = vaccinations.iloc[ : , [0]].apply(pd.to_datetime)
```

Show Data

```
In [13]: vaccinations.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 283 entries, 0 to 282
Data columns (total 21 columns):

#	Column	Non-Null Count	Dtype
0	date	283 non-null	datetime64[ns]
1	dosen_kumulativ	283 non-null	int64
2	dosen_biontech_kumulativ	283 non-null	int64
3	<pre>dosen_biontech_dritt_kumulativ</pre>	283 non-null	int64
4	dosen_moderna_kumulativ	283 non-null	int64
5	dosen_moderna_dritt_kumulativ	283 non-null	int64
6	dosen_astra_kumulativ	283 non-null	int64
7	<pre>dosen_astra_dritt_kumulativ</pre>	283 non-null	int64
8	dosen_johnson_kumulativ	283 non-null	int64
9	dosen_erst_kumulativ	283 non-null	int64
10	dosen_zweit_kumulativ	283 non-null	int64
11	dosen_dritt_kumulativ	283 non-null	int64
12	dosen_differenz_zum_vortag	283 non-null	int64
13	<pre>dosen_erst_differenz_zum_vortag</pre>	283 non-null	int64
14	<pre>dosen_zweit_differenz_zum_vortag</pre>	283 non-null	int64
15	<pre>dosen_dritt_differenz_zum_vortag</pre>	283 non-null	int64
16	personen_erst_kumulativ	283 non-null	int64

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```
17 personen_voll_kumulativ 283 non-null int64
18 personen_auffrisch_kumulativ 283 non-null int64
19 dosen_dim_kumulativ 283 non-null int64
20 dosen_kbv_kumulativ 283 non-null int64
dtypes: datetime64[ns](1), int64(20)
memory usage: 46.6 KB
```

In [14]: vaccinations.tail(3)

Out[14]:	date	dosen_kumulativ	dosen_biontech_kumulativ	dosen_biontech_dritt_kumulativ	dosen_moderna_kumulativ	dosen_moderna_dritt_kumulativ	dos

280	2021- 10-03	108068722	82505232	767160	9673755	31260
281	2021- 10-04	108157878	82586372	784915	9676844	32352
282	2021- 10-05	108331178	82751315	825319	9679673	33051

3 rows × 21 columns

4

Check Validity

```
# get the last row / the newest available data
In [15]:
          last row = vaccinations.tail(1)
          doses used = last row['dosen kumulativ']
In [16]:
          doses used
                108331178
         282
Out[16]:
         Name: dosen kumulativ, dtype: int64
          # The number of person having been vaccinated at least once, includes those fully vaccinated
In [17]:
          at least once = last row['personen erst kumulativ']
          fully vaccinated people = last row['personen voll kumulativ']
          partially vaccinated people = at least once - fully vaccinated people
          # The johnson & Johnson vaccine is the only one used in Germany that only needs a single shot:
          johnson doses = last row['dosen johnson kumulativ']
         # Must be exactly 0
In [18]:
```

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result substraction = doses used - partially vaccinated people - (fully vaccinated people - johnson doses) * 2 - johnson

result substraction

```
Out[18]: 282
                859169
         dtvpe: int64
          result substraction == 0
In [19]:
         282
                False
Out[19]:
         dtype: bool
         Calculate columns
          vaccinations['partly vaccinated'] = round(
In [20]:
              (vaccinations['personen erst kumulativ'] - vaccinations['personen voll kumulativ']) * 100 / population germany,
              2)
          vaccinations['fully vaccinated'] = round(
In [21]:
              vaccinations['personen voll kumulativ'] * 100 / population germany,
              2)
          vaccinations.info()
In [22]:
         <class 'pandas.core.frame.DataFrame'>
         RangeIndex: 283 entries, 0 to 282
         Data columns (total 23 columns):
              Column
                                                Non-Null Count Dtype
          0
              date
                                                283 non-null
                                                                datetime64[ns]
              dosen kumulativ
                                                283 non-null
                                                                int64
              dosen biontech kumulativ
                                                283 non-null
                                                                int64
              dosen biontech dritt kumulativ
                                                283 non-null
                                                                int64
              dosen moderna kumulativ
                                                283 non-null
                                                                int64
              dosen moderna dritt kumulativ
                                                283 non-null
                                                                int64
              dosen astra kumulatīv
                                                283 non-null
                                                                int64
              dosen astra dritt kumulativ
                                                283 non-null
                                                                int64
              dosen johnson kumulativ
                                                283 non-null
                                                                int64
              dosen erst kumulativ
                                                283 non-null
                                                                int64
          10 dosen zweit kumulativ
                                                283 non-null
                                                                int64
          11 dosen dritt kumulativ
                                                283 non-null
                                                                int64
          12 dosen differenz zum vortag
                                                283 non-null
                                                                int64
              dosen erst differenz zum vortag
                                                283 non-null
                                                                int64
          14 dosen zweit differenz zum vortag 283 non-null
                                                                int64
          15 dosen dritt differenz zum vortag 283 non-null
                                                                int64
              personen erst kumulativ
                                                283 non-null
                                                                int64
```

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```
personen voll kumulativ
                                                   283 non-null
                                                                     int64
               personen auffrisch kumulativ
                                                   283 non-null
                                                                     int64
               dosen dim kumulativ
                                                   283 non-null
                                                                     int64
           20 dosen kbv kumulativ
                                                   283 non-null
                                                                     int64
           21 partly vaccinated
                                                   283 non-null
                                                                     float64
           22 fully vaccinated
                                                   283 non-null
                                                                     float64
          dtypes: datetime64[ns](1), float64(2), int64(20)
         memory usage: 51.0 KB
          vaccinations.tail(3)
In [23]:
Out[23]:
               date dosen kumulativ dosen biontech kumulativ dosen biontech dritt kumulativ dosen moderna kumulativ dosen moderna dritt kumulativ dosen
              2021-
          280
                          108068722
                                                 82505232
                                                                              767160
                                                                                                    9673755
                                                                                                                                 31260
```

 280
 10-03
 108068722
 82505232
 767160
 9673753
 31260

 281
 2021- 10-04
 108157878
 82586372
 784915
 9676844
 32352

 282
 2021- 10-05
 108331178
 82751315
 825319
 9679673
 33051

3 rows × 23 columns

.

Last Update

Often the data is not updated on weekends, so get the highest date in the dataset.

```
In [24]: last_update = vaccinations.loc[vaccinations.index[-1], "date"].strftime('%Y-%m-%d')
last_update
Out[24]: '2021-10-05'
```

Doses Used

```
In [25]: doses = vaccinations.loc[ : , ['date', 'dosen_differenz_zum_vortag']]
# Rename columns
doses.columns = ['date', 'doses used']
In [26]: # Scale number of doses as millions
```

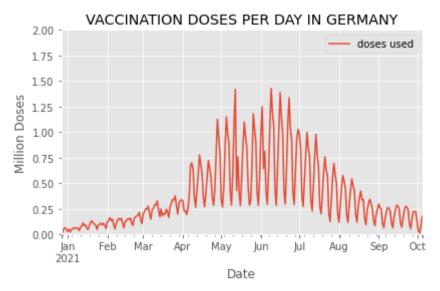
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```
doses['doses used'] = doses['doses used'] / 1 000 000
```

Doses Daily

```
In [27]:
          doses daily = doses.set index('date', inplace=False)
          doses daily.tail(1)
Out[27]:
                   doses used
              date
                       0.1733
         2021-10-05
          # What is the highest number of doses used in a day?
In [28]:
          max doses daily = max(doses daily['doses used'])
          max doses daily
Out[28]: 1.428013
          doses daily.plot(
In [29]:
              ylim=(0,math.ceil(max doses daily)),
              xlabel='Date',
              ylabel='Million Doses',
              title='VACCINATION DOSES PER DAY IN GERMANY')
Out[29]: <AxesSubplot:title={'center':'VACCINATION DOSES PER DAY IN GERMANY'}, xlabel='Date', ylabel='Million Doses'>
```

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Doses per Weekday (in the last 6 weeks)

```
last 6 weeks = doses.tail(42)
In [30]:
In [31]:
          # Yields a warning, but exactly like the docs prescribe and it works
          # https://pandas.pydata.org/docs/getting started/intro tutorials/05 add columns.html
          last 6 weeks['weekday'] = last 6 weeks['date'].dt.day name()
         <ipython-input-31-45013977109e>:3: SettingWithCopyWarning:
         A value is trying to be set on a copy of a slice from a DataFrame.
         Try using .loc[row indexer,col indexer] = value instead
         See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user guide/indexing.html#returning-a
         -view-versus-a-copy
           last 6 weeks['weekday'] = last 6 weeks['date'].dt.day name()
          # check:
In [32]:
          last 6 weeks.tail(3)
Out[32]:
                   date doses used weekday
         280 2021-10-03
                          0.013049
                                   Sunday
         281 2021-10-04
                          0.089156
                                   Monday
         282 2021-10-05
                          0.173300
                                  Tuesday
```

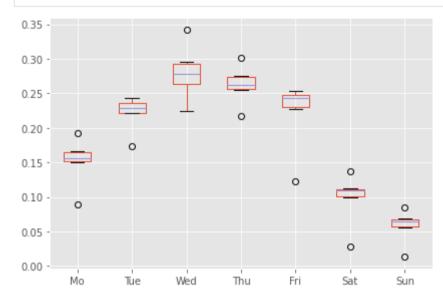
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```
# drop the date column
In [331:
          last 6 weeks = last 6 weeks.drop(labels=['date'], axis=1)
          #last 6 weeks.set index('weekday', inplace=True)
In [34]:
          last 6 weeks.tail(3)
Out[34]:
              doses used weekday
          280
                0.013049
                          Sunday
          281
                0.089156
                          Monday
          282
                0.173300
                         Tuesday
          pivot table =last 6 weeks.pivot(columns='weekday', values='doses used')
In [35]:
          pivot table.tail()
Out[35]: weekday
                                             Sunday Thursday Tuesday Wednesday
                    Friday
                           Monday Saturday
              278 0.122964
                              NaN
                                       NaN
                                                NaN
                                                         NaN
                                                                 NaN
                                                                           NaN
              279
                      NaN
                              NaN
                                   0.027954
                                               NaN
                                                         NaN
                                                                 NaN
                                                                           NaN
              280
                      NaN
                                           0.013049
                              NaN
                                       NaN
                                                         NaN
                                                                 NaN
                                                                           NaN
              281
                      NaN
                          0.089156
                                       NaN
                                                NaN
                                                         NaN
                                                                 NaN
                                                                           NaN
              282
                      NaN
                              NaN
                                       NaN
                                               NaN
                                                         NaN
                                                               0.1733
                                                                           NaN
          # Reorder the columns
In [36]:
          pivot table = pivot table[['Monday', 'Tuesday', 'Wednesday', 'Thursday', 'Friday', 'Saturday', 'Sunday']]
          # Rename the columns
          pivot table.columns=['Mo', 'Tue', 'Wed', 'Thu', 'Fri', 'Sat', 'Sun']
          pivot table.tail()
Out[36]:
                         Tue Wed Thu
                                            Fri
                   Mo
                                                    Sat
                                                            Sun
          278
                  NaN
                        NaN
                             NaN
                                  NaN 0.122964
                                                    NaN
                                                            NaN
          279
                                               0.027954
                  NaN
                        NaN
                             NaN
                                  NaN
                                           NaN
                                                            NaN
                                                    NaN 0.013049
          280
                  NaN
                        NaN
                             NaN
                                  NaN
                                           NaN
          281 0.089156
                                           NaN
                                                   NaN
                                                            NaN
                        NaN NaN NaN
```

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	Мо	Tue	Wed	Thu	Fri	Sat	Sun
282	NaN	0.1733	NaN	NaN	NaN	NaN	NaN

```
In [37]: | weekday_boxplot = pivot_table.boxplot()
```



```
In [38]: fig = weekday_boxplot.get_figure()
fig.savefig('img/weekday_boxplot.png')
```

Doses per Week

```
In [39]: # W-Mon in order to start the week on a Monday, see:
    # https://pandas.pydata.org/pandas-docs/stable/user_guide/timeseries.html#anchored-offsets
    doses_weekly = doses.groupby(pd.Grouper(key='date',freq='W-Mon')).sum()
    doses_weekly.columns = ['million doses used']
    doses_weekly.tail()
```

Out[39]: million doses used

date	
2021-09-13	1.307178
2021-09-20	1.384101

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million doses used

date	
2021-09-27	1.319470
2021-10-04	0.915313
2021-10-11	0.173300

```
In [40]: # What is the highest number of doses used in a week?
max_million_doses_weekly = max(doses_weekly['million doses used'])
max_million_doses_weekly
```

Out[40]: 6.124207

```
In [41]: doses_weekly.plot(
    ylim=(0, math.ceil(max_million_doses_weekly)),
    xlabel='Date',
    ylabel='Million Doses',
    title=f"VACCINATION DOSES PER WEEK IN GERMANY\n(until {last_update})")
```


Doses per Month

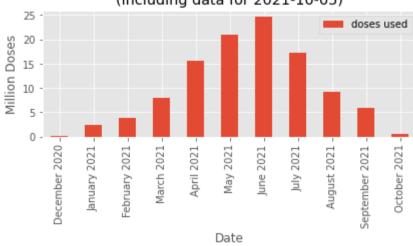
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```
# M = month end frequency
In [42]:
          doses monthly = doses.groupby(pd.Grouper(key='date',freg='M')).sum()
          doses monthly.tail()
Out[42]:
                    doses used
               date
          2021-06-30
                     24.754816
          2021-07-31
                     17.259541
          2021-08-31
                      9.266226
          2021-09-30
                      5.800109
          2021-10-31
                      0.426423
          max doses monthly = max(doses monthly['doses used'])
In [43]:
          max doses monthly
          doses monthly['month'] = doses monthly.index.strftime('%B')
          doses monthly['year'] = doses monthly.index.strftime('%Y')
          doses monthly['label'] = doses monthly['month'] + ' ' + doses_monthly['year']
          doses monthly.drop(columns=['month', 'year'], inplace=True)
          doses monthly.set index('label', inplace=True)
          doses monthly.tail(6)
Out[43]:
                        doses used
                   label
               May 2021
                         21.057572
               June 2021
                         24.754816
               July 2021
                         17.259541
             August 2021
                          9.266226
          September 2021
                          5.800109
            October 2021
                          0.426423
          monthly plot = doses monthly.plot.bar(
In [44]:
               ylim=(0,math.ceil(max doses monthly) + 1),
               xlabel='Date',
```

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```
ylabel='Million Doses',
title=f"VACCINATION DOSES PER MONTH IN GERMANY\n(including data for {last_update})")
```

VACCINATION DOSES PER MONTH IN GERMANY (including data for 2021-10-05)



```
In [45]: fig = monthly_plot.get_figure()
fig.savefig('img/monthly_doses_germany.png')
```

Vaccination Campaign Progress

```
In [46]: doses_cumulative = vaccinations.loc[ : , ['date', 'partly vaccinated', 'fully vaccinated']]
    doses_cumulative.set_index('date', inplace=True)
    doses_cumulative.tail(3)
```

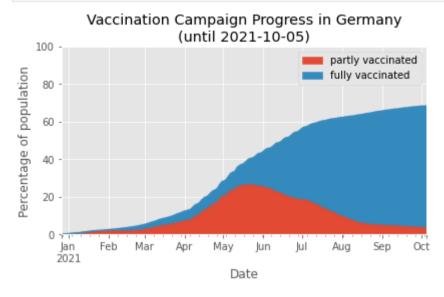
Out [46]: partly vaccinated fully vaccinated

date		
2021-10-03	3.50	64.64
2021-10-04	3.48	64.69
2021-10-05	3.44	64.79

```
In [47]: doses_area_plot = doses_cumulative.plot.area(
    ylim=(0,100),
    xlabel='Date',
```

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```
ylabel='Percentage of population',
title=f"Vaccination Campaign Progress in Germany\n(until {last_update})")
```



```
In [48]: fig = doses_area_plot.get_figure()
fig.savefig('img/vaccinations_germany_area_plot.png')
```

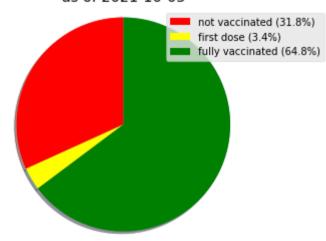
As of Today

```
In [49]:
          # get the last line of the data
          current state = doses cumulative.iloc[-1]
          current state
         partly vaccinated
                               3.44
Out[49]:
         fully vaccinated
                              64.79
         Name: 2021-10-05 00:00:00, dtype: float64
          percentage not vacc = 100 - current state['partly vaccinated'] - current state['fully vaccinated']
In [50]:
          labels = [f"not vaccinated ({round(percentage not vacc, 1)}%)",
                    f"first dose ({round(current state['partly vaccinated'], 1)}%)",
                    f"fully vaccinated ({round(current state['fully vaccinated'], 1)}%)"]
          colors = ['red', 'yellow', 'green']
          sizes = [percentage not vacc,
                   current state['partly vaccinated'],
                   current state['fully vaccinated']]
          fiq1, ax1 = plt.subplots()
```

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```
ax1.pie(sizes, shadow=True, startangle=90)
ax1.axis('equal')  # Equal aspect ratio ensures that pie is drawn as a circle.
patches, texts = plt.pie(sizes, colors=colors, startangle=90)
plt.legend(patches, labels, loc="best")
plt.title(f"Vaccination Progress in Germany\nas of {last_update}")
# plt.savefig must be before show()
# BEWARE plt.savefig must be in the same Jupyter code cell that creates the graph!
# See comment by ijoseph here:
# https://stackoverflow.com/questions/9012487/matplotlib-pyplot-savefig-outputs-blank-image
plt.savefig('img/vaccination_in_germany_pie.png', bbox_inches='tight')
plt.show()
```

Vaccination Progress in Germany as of 2021-10-05

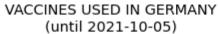


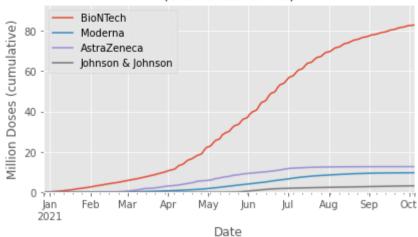
Vaccines in Use

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```
'dosen dim kumulativ', 'dosen kby kumulativ', 'partly vaccinated',
                 'fully vaccinated'l,
               dtype='object')
          vaccine use = vaccinations.loc[ : , ['date', 'dosen biontech kumulativ',
In [52]:
                                                'dosen moderna kumulativ',
                                                'dosen astra kumulativ',
                                                 'dosen johnson kumulativ']]
          # Rename columns
          vaccine use.columns = ['date', 'BioNTech', 'Moderna', 'AstraZeneca', 'Johnson & Johnson']
          # make 'date' an index
          vaccine use.set index('date', inplace=True)
          # divide columns by 1 million
          vaccine use["BioNTech"] = vaccine use["BioNTech"] / 1 000 000
          vaccine use["Moderna"] = vaccine use["Moderna"] / 1 000 000
          vaccine use["AstraZeneca"] = vaccine use["AstraZeneca"] / 1 000 000
          vaccine use["Johnson & Johnson"] = vaccine use["Johnson & Johnson"] / 1 000 000
          vaccine use.tail(3)
Out[52]:
                   BioNTech Moderna AstraZeneca Johnson & Johnson
              date
         2021-10-03 82.505232 9.673755
                                                        3.196158
                                       12.693577
         2021-10-04 82.586372 9.676844
                                       12.694309
                                                        3.200353
         2021-10-05 82.751315 9.679673
                                       12.695147
                                                        3.205043
          vaccines used = vaccine use.plot(
In [53]:
              # as it is cumulative, the last row must contain the single highest number
              ylim=(0,math.ceil(max(vaccine use.iloc[-1]))+10),
              xlabel='Date',
              ylabel='Million Doses (cumulative)',
              title=f"VACCINES USED IN GERMANY\n(until {last update})")
```

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```
In [54]: fig = vaccines_used.get_figure()
fig.savefig('img/vaccines_used_in_germany.png')
```

Vaccination Centers versus Doctor's Practices

In [55]:	vaccinations.tail()								
Out[55]:		date	dosen_kumulativ	dosen_biontech_kumulativ	dosen_biontech_dritt_kumulativ	dosen_moderna_kumulativ	dosen_moderna_dritt_kumulativ	dos	
	278	2021- 10-01	108027719	82470530	762629	9671141	30877		
	279	2021- 10-02	108055673	82494213	765716	9672651	31042		
	280	2021- 10-03	108068722	82505232	767160	9673755	31260		
	281	2021- 10-04	108157878	82586372	784915	9676844	32352		
	282	2021- 10-05	108331178	82751315	825319	9679673	33051		

5 rows × 23 columns

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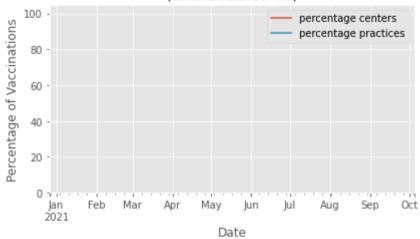
```
by place = vaccinations.loc[ : , ['date', 'dosen dim kumulativ', 'dosen kbv kumulativ']]
In [56]:
          by place.columns = ['date', 'vaccination centers', 'practices']
          by place['vaccination centers daily'] = by place['vaccination centers'].diff()
In [57]:
          by place['practices daily'] = by place['practices'].diff()
          by place['percentage practices'] = round(
In [58]:
               by place['practices daily'] * 100 /
               (by place['vaccination centers daily'] + by place['practices daily']), 2)
          by place['percentage centers'] = 100 - by place['percentage practices']
          # make 'date' an index
In [591:
          by place.set index('date', inplace=True)
          by place
In [60]:
Out[60]:
                    vaccination centers practices vaccination centers daily practices daily percentage practices percentage centers
               date
          2020-12-27
                                   0
                                            0
                                                               NaN
                                                                             NaN
                                                                                               NaN
                                                                                                                NaN
          2020-12-28
                                   0
                                            0
                                                                0.0
                                                                              0.0
                                                                                               NaN
                                                                                                                NaN
                                            0
                                                                0.0
          2020-12-29
                                                                              0.0
                                                                                               NaN
                                                                                                                NaN
          2020-12-30
                                   0
                                                                0.0
                                                                              0.0
                                                                                               NaN
                                                                                                                NaN
          2020-12-31
                                   0
                                            0
                                                                0.0
                                                                              0.0
                                                                                               NaN
                                                                                                                NaN
          2021-10-01
                                   0
                                            0
                                                                0.0
                                                                              0.0
                                                                                               NaN
                                                                                                                NaN
          2021-10-02
                                   0
                                            0
                                                                0.0
                                                                              0.0
                                                                                               NaN
                                                                                                                NaN
          2021-10-03
                                   0
                                            0
                                                                0.0
                                                                              0.0
                                                                                               NaN
                                                                                                                NaN
          2021-10-04
                                   0
                                            0
                                                                0.0
                                                                              0.0
                                                                                               NaN
                                                                                                                NaN
                                   0
                                            0
                                                                0.0
                                                                              0.0
          2021-10-05
                                                                                               NaN
                                                                                                                NaN
```

283 rows × 6 columns

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```
In [61]: share = by_place.loc[ : , ['percentage centers', 'percentage practices']]
In [62]: vacc_shares = share.plot(
    # as it is cumulative, the last row must contain the single highest number
    ylim=(0, 105), # above 100 to see the line
    xlabel='Date',
    ylabel='Percentage of Vaccinations',
    title=f"Place of Vaccination in Germany\n(until {last_update})")
```

Place of Vaccination in Germany (until 2021-10-05)



```
In [63]: fig = vacc_shares.get_figure()
fig.savefig('img/vaccinations_germany_by_place.png')
```

Other units of Time

```
In [64]: by_place_daily = by_place.loc[ : , ['vaccination centers daily', 'practices daily']]
by_place_daily.columns = ['vaccination centers', 'practices']
by_place_daily.reset_index(inplace=True)
```

Monthly

```
In [65]: by_place_monthly = by_place_daily.groupby(pd.Grouper(key='date',freq='M')).sum()
```

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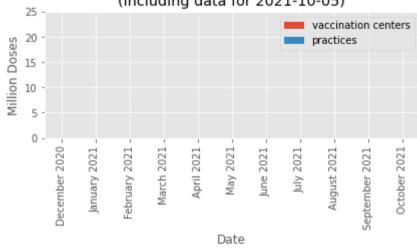
```
by place monthly.tail()
Out[65]:
                    vaccination centers practices
               date
          2021-06-30
                                  0.0
                                           0.0
          2021-07-31
                                  0.0
                                           0.0
          2021-08-31
                                  0.0
                                           0.0
          2021-09-30
                                  0.0
                                           0.0
          2021-10-31
                                  0.0
                                           0.0
         Scale:
           by place monthly['vaccination centers'] = by place monthly['vaccination centers'] / 1 000 000
In [66]:
           by place monthly['practices'] = by place monthly['practices'] / 1 000 000
         Rename the columns
           by place monthly['month'] = by place monthly.index.strftime('%B')
In [67]:
           by place monthly['year'] = by place monthly.index.strftime('%Y')
          by place monthly['label'] = by place monthly['month'] + ' ' + by place monthly['year']
           by place monthly.drop(columns=['month', 'year'], inplace=True)
           by place monthly.set index('label', inplace=True)
           by place monthly.tail(6)
Out[67]:
                         vaccination centers practices
                   label
                May 2021
                                      0.0
                                               0.0
               June 2021
                                      0.0
                                               0.0
               July 2021
                                      0.0
                                               0.0
             August 2021
                                      0.0
                                               0.0
          September 2021
                                      0.0
                                               0.0
            October 2021
                                      0.0
                                               0.0
```

In [68]: monthly_plot = by_place_monthly.plot.bar(

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```
stacked=True,
ylim=(0, 25),
xlabel='Date',
ylabel='Million Doses',
title=f"VACCINATION DOSES BY PLACE IN GERMANY\n(including data for {last_update})")
```

VACCINATION DOSES BY PLACE IN GERMANY (including data for 2021-10-05)



```
In [69]: fig = monthly_plot.get_figure()
fig.savefig('img/monthly_doses_by_place_germany.png')
```

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