## **Extracting Wikipedia data**

Now I've got my hand onto the API and I know I can loop it, so I'm going to extract the data and save it as a proper date-time-formatted dataframe. I will save the most seen 1000 articles per day...

```
In [17]: # first...
         import requests
         import json
         import pandas as pd
         from datetime import datetime
         #initialize dataframe for simplicity
         maindf = pd.DataFrame()
         response = requests.get('https://wikimedia.org/api/rest v1/metrics/pa
         geviews/top/en.wikipedia/all-access/2015/12/31')
         datetime object = datetime.strptime('2015/12/31','%Y/%m/%d')
         maindf = pd.DataFrame(json.loads(response.content.decode('utf-8'))['i
         tems'][0]['articles'])
         #df = pd.DataFrame(list(data.items()), columns=['Date', 'DateValue'])
         #df['Date'] = pd.to datetime(df['Date'])
In [18]:
         maindf = maindf.set index('article')
         print(maindf.head(10))
         viewsdf=pd.DataFrame()
         ranksdf=pd.DataFrame()
         viewsdf['2015/12/31'] = maindf['views']
         ranksdf['2015/12/31'] = maindf['rank']
                                                          rank
                                                                   views
         article
                                                                16839014
         Main Page
                                                             1
         Special:Export/
                                                             2
                                                                 3630692
         Special:Search
                                                             3
                                                                 1704369
         Special:Book
                                                             4
                                                                  407340
                                                             5
         Star Wars: The Force Awakens
                                                                  386649
         Ethan Couch
                                                             6
                                                                  208390
         Star Wars
                                                             7
                                                                  207870
         New Year's Eve
                                                             8
                                                                  186715
         List of stock market crashes and bear markets
                                                             9
                                                                  179200
         Steven_Avery
                                                            10
                                                                  166410
```

I want to keep on completeing this and then transpose it to have the times as rows and be able to plot the time evolution for each article, calculate increase wrt the previous day, etc.

```
In [1]:
        import requests
        import json
        import pandas as pd
        #initialize dataframe for simplicity
        maindf = pd.DataFrame()
        response = requests.get('https://wikimedia.org/api/rest v1/metrics/pa
        geviews/top/en.wikipedia/all-access/2015/12/31')
        maindf = pd.DataFrame(json.loads(response.content.decode('utf-8'))['i
        tems'][0]['articles'])
        maindf = maindf.set index('article')
        viewsdf=pd.DataFrame()
        ranksdf=pd.DataFrame()
        viewsdf['2015/12/31'] = maindf['views']
        ranksdf['2015/12/31'] = maindf['rank']
        # iterate
        mainreq = 'https://wikimedia.org/api/rest v1/metrics/pageviews/top/e
        n.wikipedia/all-access/'
        for year in ['2016']:
            for month in range(1,4): # typically to 13
                 if month in [1,3,5,7,8,10,12]:
                    # there's 31 days
                     for day in range(1,32):
                         # get request and do the things
                         response = requests.get(mainreq+str(year)+'/'+str(mon
        th).rjust(2, '0')+'/'+str(day).rjust(2, '0'))
                         if not (response.status code==200):
                             print('Oops something went wrong for ' + str(year
        )+'/'+str(month).rjust(2, '0')+'/'+str(day).rjust(2, '0'))
                         dftemp = pd.DataFrame(json.loads(response.content.dec
        ode('utf-8'))['items'][0]['articles'])
                         # change a couple of things for the merging...
                         dftemp = dftemp.set index('article')
                         dftemp = dftemp.rename(columns={'views': str(year)+
         '/'+str(month).rjust(2, '0')+'/'+str(day).rjust(2, '0')})
                        viewsdf = viewsdf.join(dftemp.drop(columns=['rank']),
         how='outer')
                         dftemp = dftemp.drop(columns=[str(year)+'/'+str(month)
        ).rjust(2, '0')+'/'+str(day).rjust(2, '0')])
                         dftemp = dftemp.rename(columns={'rank': str(year)+'/'
        +str(month).rjust(2, '0')+'/'+str(day).rjust(2, '0')})
                         ranksdf = ranksdf.join(dftemp, how='outer')
                 if month in [4,6,9,11]:
                     # there's 30 days
                     for day in range(1,31):
                         # get request and do the things
                         response = requests.get(mainreg+str(year)+'/'+str(mon
        th).rjust(2, '0')+'/'+str(day).rjust(2, '0'))
                         if not (response.status code==200):
                             print('Oops something went wrong for ' + str(year
        )+'/'+str(month).rjust(2, '0')+'/'+str(day).rjust(2, '0'))
                         dftemp = pd.DataFrame(json.loads(response.content.dec
        ode('utf-8'))['items'][0]['articles'])
                         # change a couple of things for the merging...
```

```
dftemp = dftemp.set index('article')
                dftemp = dftemp.rename(columns={'views': str(year)+
'/'+str(month).rjust(2, '0')+'/'+str(day).rjust(2, '0')})
                viewsdf = viewsdf.join(dftemp.drop(columns=['rank']),
how='outer')
                dftemp = dftemp.drop(columns=[str(year)+'/'+str(month
).rjust(2, '0')+'/'+str(day).rjust(2, '0')])
                dftemp = dftemp.rename(columns={'rank': str(year)+'/'
+str(month).rjust(2, '0')+'/'+str(day).rjust(2, '0')})
                ranksdf = ranksdf.join(dftemp, how='outer')
        if month == 2:
            # there's 28 days
            for day in range (1,29):
                # get request and do the things
                response = requests.get(mainreq+str(year)+'/'+str(mon
th).rjust(2, '0')+'/'+str(day).rjust(2, '0'))
                if not (response.status code==200):
                    print('Oops something went wrong for ' + str(year
)+'/'+str(month).rjust(2, '0')+'/'+str(day).rjust(2, '0'))
                dftemp = pd.DataFrame(json.loads(response.content.dec
ode('utf-8'))['items'][0]['articles'])
                # change a couple of things for the merging...
                dftemp = dftemp.set index('article')
                dftemp = dftemp.rename(columns={'views': str(year)+
'/'+str(month).rjust(2, '0')+'/'+str(day).rjust(2, '0')})
                viewsdf = viewsdf.join(dftemp.drop(columns=['rank']),
how='outer')
                dftemp = dftemp.drop(columns=[str(year)+'/'+str(month
).rjust(2, '0')+'/'+str(day).rjust(2, '0')])
                dftemp = dftemp.rename(columns={'rank': str(year)+'/'
+str(month).rjust(2, '0')+'/'+str(day).rjust(2, '0')})
                ranksdf = ranksdf.join(dftemp, how='outer')
        # now maindf should have the data with the right labels and a
11...
        print('Month '+str(month).rjust(2, '0')+' done')
```

Month 01 done Month 02 done Month 03 done In [4]: | viewsdf.info()

```
<class 'pandas.core.frame.DataFrame'>
ص Index: 12848 entries, "Heroes"_(David_Bowie_album) to
Data columns (total 91 columns):
2015/12/31
              1000 non-null float64
2016/01/01
              1000 non-null float64
2016/01/02
              1000 non-null float64
2016/01/03
              999 non-null float64
2016/01/04
              1000 non-null float64
2016/01/05
              1000 non-null float64
              1000 non-null float64
2016/01/06
              1000 non-null float64
2016/01/07
2016/01/08
              1000 non-null float64
2016/01/09
              999 non-null float64
2016/01/10
              1000 non-null float64
2016/01/11
              1000 non-null float64
2016/01/12
              999 non-null float64
              1000 non-null float64
2016/01/13
              1000 non-null float64
2016/01/14
2016/01/15
              1000 non-null float64
2016/01/16
              1000 non-null float64
              1000 non-null float64
2016/01/17
              1000 non-null float64
2016/01/18
2016/01/19
              1000 non-null float64
2016/01/20
              1000 non-null float64
2016/01/21
              1000 non-null float64
              1000 non-null float64
2016/01/22
2016/01/23
              1000 non-null float64
2016/01/24
              999 non-null float64
2016/01/25
              1000 non-null float64
              1000 non-null float64
2016/01/26
2016/01/27
              1000 non-null float64
              1000 non-null float64
2016/01/28
              1000 non-null float64
2016/01/29
2016/01/30
              999 non-null float64
2016/01/31
              1000 non-null float64
              1000 non-null float64
2016/02/01
              1000 non-null float64
2016/02/02
              1000 non-null float64
2016/02/03
2016/02/04
              1000 non-null float64
              1000 non-null float64
2016/02/05
              1000 non-null float64
2016/02/06
2016/02/07
              1000 non-null float64
2016/02/08
              1000 non-null float64
2016/02/09
              999 non-null float64
2016/02/10
              1000 non-null float64
              1000 non-null float64
2016/02/11
2016/02/12
              1000 non-null float64
2016/02/13
              1000 non-null float64
2016/02/14
              1000 non-null float64
2016/02/15
              1000 non-null float64
              1000 non-null float64
2016/02/16
2016/02/17
              1000 non-null float64
2016/02/18
              1000 non-null float64
2016/02/19
              1000 non-null float64
              1000 non-null float64
2016/02/20
              1000 non-null float64
2016/02/21
              1000 non-null float64
2016/02/22
```

```
2016/02/23
              1000 non-null float64
2016/02/24
              1000 non-null float64
2016/02/25
              1000 non-null float64
2016/02/26
              1000 non-null float64
2016/02/27
              1000 non-null float64
2016/02/28
              1000 non-null float64
2016/03/01
              1000 non-null float64
2016/03/02
              1000 non-null float64
2016/03/03
              999 non-null float64
2016/03/04
              1000 non-null float64
2016/03/05
              1000 non-null float64
2016/03/06
              1000 non-null float64
2016/03/07
              1000 non-null float64
              1000 non-null float64
2016/03/08
2016/03/09
              1000 non-null float64
              1000 non-null float64
2016/03/10
              1000 non-null float64
2016/03/11
              1000 non-null float64
2016/03/12
2016/03/13
              1000 non-null float64
2016/03/14
              1000 non-null float64
              999 non-null float64
2016/03/15
2016/03/16
              1000 non-null float64
2016/03/17
              1000 non-null float64
              1000 non-null float64
2016/03/18
2016/03/19
              1000 non-null float64
              1000 non-null float64
2016/03/20
2016/03/21
              1000 non-null float64
2016/03/22
              1000 non-null float64
2016/03/23
              1000 non-null float64
2016/03/24
              999 non-null float64
2016/03/25
              999 non-null float64
              1000 non-null float64
2016/03/26
              1000 non-null float64
2016/03/27
2016/03/28
              1000 non-null float64
2016/03/29
              1000 non-null float64
2016/03/30
              1000 non-null float64
2016/03/31
              1000 non-null float64
dtypes: float64(91)
memory usage: 9.0+ MB
```

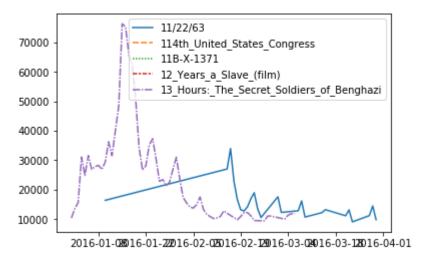
```
In [5]:
         ranksdf.describe()
```

```
In [2]:
         viewsdf.head(25)
```

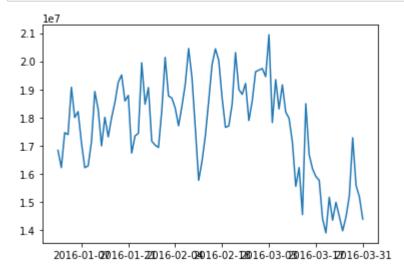
Now, let's try to plot something, but first I want to use the transpose and parse dates for the indices. Then, let's say we pick '11.22.63' and see the evolution of the views using seaborn. After that, I want to pick the top 20 for each date and plot all, ignoring 'main page' (btw who tf opens wikipedia main page?)

```
In [3]:
        vewsdates = viewsdf.T
        vewsdates.index = pd.to_datetime(vewsdates.index)
```

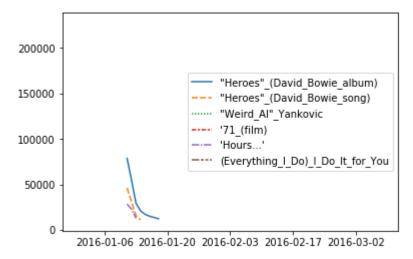
```
import seaborn as sns
In [9]:
        import matplotlib.pyplot as plt
        sns.lineplot(data=vewsdates.iloc[:,15:20])
        plt.show()
```



In [15]: sns.lineplot(data=vewsdates['Main\_Page']) plt.show()

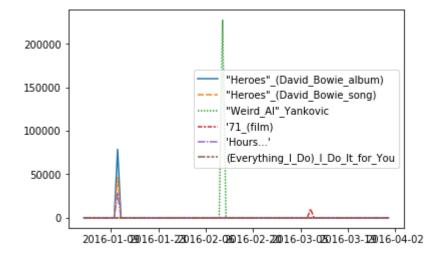


```
sns.lineplot(data=vewsdates.iloc[:,0:6])
In [18]:
         plt.show()
```

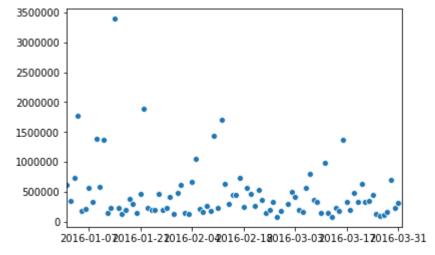


Noice!, Let's try to find the increases and plot them!

```
In [20]:
         vdch = vewsdates.fillna(1).pct_change()
         sns.lineplot(data=vdch.iloc[:,0:6])
         plt.show()
```



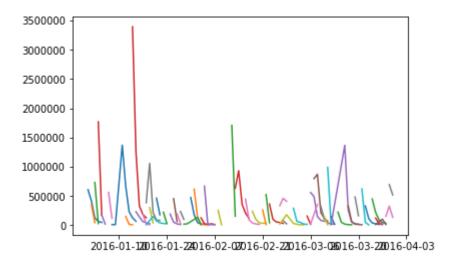
```
# to find the column that has the max, use df.idxmax(axis=1)
In [30]:
         # to find the maxvalue, use df.max(axis=1)
         vdch = vewsdates.fillna(1).pct change()
         vdch['MaxPctChange']=vdch.max(axis=1)
         vdch['Art maxpctch']=vdch.idxmax(axis=1)
         sns.scatterplot(data=vdch['MaxPctChange'], hue=vdch['Art_maxpctch'])
         plt.xlim(['2016/01','2016/04'])
         plt.show()
         vdch[['MaxPctChange','Art maxpctch']].head(20)
```



Clearly the top is now enough, I want to select the views above 75% of the greatest increase... or something like that That will probably define peaks better.

Otherwise I could find the peakest peak for every column and plot it overlapping... I like that idea too!

```
In [75]: leglist = []
         for rowidx in range(1,vdch['MaxPctChange'].size):
             # ignore the first one because is a nan
             colname = vdch.iloc[rowidx]['Art maxpctch']
             valstopl = vewsdates.iloc[max(rowidx-5,0):min(rowidx+5,vdch['MaxP
         ctChange'].size-1)][colname].dropna()
             sns.lineplot(data=valstopl)
             if rowidx%10==0:
                 leglist.append(colname)
         #plt.yscale('log')
         #plt.legend(leglist)
         plt.show()
         print('Peak order')
         print(vdch.iloc[:]['Art_maxpctch'])
```

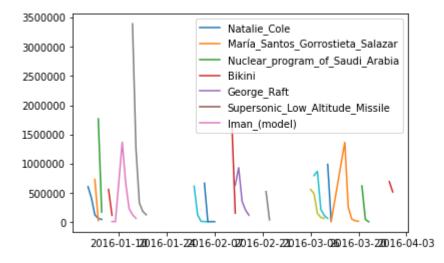


Peak order	
2015-12-31	NaN
2016-01-01	Natalie_Cole
2016-01-02	Lady_Mary_Wortley_Montagu
2016-01-03	María_Santos_Gorrostieta_Salazar
2016-01-04	Nuclear_program_of_Saudi_Arabia
2016-01-05	List_of_aviators_by_nickname
2016-01-06	Kangaroo
2016-01-07 2016-01-08	Bikini Chichijima incident
2016-01-08	George Raft
2016-01-10	Supersonic_Low_Altitude_Missile
2016-01-11	Iman (model)
2016-01-12	Derrick_Henry
2016-01-13	Shetland_sheep
2016-01-14	Alan_Rickman
2016-01-15	10_Cloverfield_Lane
2016-01-16	The_Lion_King
2016-01-17 2016-01-18	Larry_Fitzgerald Glenn Frey
2016-01-18	Salt
2016-01-19	Suicide_Squad
2016-01-21	April Ludgate
2016-01-22	Xerostomia
2016-01-23	Aurora_(Disney_character)
2016-01-24	1995_Airstan_incident
2016-01-25	Kalpana_(Malayalam_actress)
2016-01-26	John_Logie_Baird
2016-01-27 2016-01-28	Container_deposit_legislation_in_the_United_St
2016-01-28	Harry_Markopolos Genealogy of Rama
2010 01 23	
2016-03-02	Complement_system
2016-03-03	NAND_logic
2016-03-04	Dendrocnide_moroides
2016-03-05	Media_cross-ownership_in_the_United_States
2016-03-06	Nancy_Reagan
2016-03-07 2016-03-08	Meldonium English_Wikipedia
2016-03-08	George Martin
2016-03-10	Steve Burns
2016-03-11	Lupe Fuentes
2016-03-12	CEverett_Koop
2016-03-13	List_of_Gundam_video_games
2016-03-14	Alicia_Witt
2016-03-15	Superman: _Red_Son
2016-03-16 2016-03-17	Merrick_Garland Frank_Sinatra,_Jr.
2016-03-17	Richard Lawrence (failed assassin)
2016-03-10	Zach_Braff
2016-03-20	Troubadour
2016-03-21	Bluetooth
2016-03-22	Brussels
2016-03-23	_John_Cazale
2016-03-24	Johan_Cruyff
2016-03-25	Jishnu Siman Bana
2016-03-26	Simon_Pegg

```
2016-03-27
                                            Villanova University
2016-03-28
                                               Category: Abu_Nidal
2016-03-29
                                                       Patty Duke
                                    American_Airlines_Flight_191
2016-03-30
2016-03-31
                                                   Ronnie Corbett
Name: Art_maxpctch, Length: 91, dtype: object
```

For simplicity, can we crop the peaks with only more than 500.000 views? OF course we can!

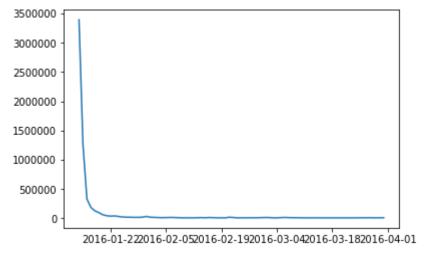
```
In [84]:
         leglist = []
         threshold = 500000
         for rowidx in range(1,vdch['MaxPctChange'].size):
             # ignore the first one because is a nan
             colname = vdch.iloc[rowidx]['Art maxpctch']
             if vewsdates.iloc[rowidx][colname] >= threshold:
                  valstopl = vewsdates.iloc[max(rowidx-5,0):min(rowidx+5,vdch[
          'MaxPctChange'].size-1)][colname].dropna()
                 sns.lineplot(data=valstopl)
                  leglist.append(colname)
         #plt.yscale('log')
         plt.legend(leglist[0:7])
         plt.show()
         print('Peak order')
         #print(vdch.iloc[:]['Art maxpctch'])
         print(leglist)
```



## Peak order

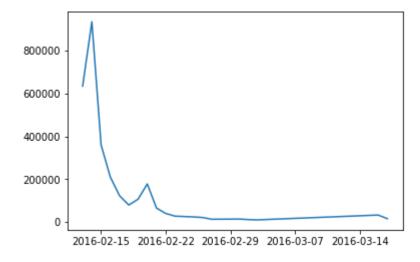
['Natalie\_Cole', 'María\_Santos\_Gorrostieta\_Salazar', 'Nuclear\_program \_of\_Saudi\_Arabia', 'Bikini', 'George\_Raft', 'Supersonic\_Low\_Altitude\_ Missile', 'Iman\_(model)', 'Alan\_Rickman', 'Xerostomia', 'Frederick\_Do uglass', 'Pride\_and\_Prejudice', 'Warzone\_2100', 'Christopher\_Paul\_Nei l', 'Omayra\_Sánchez', 'Antonin\_Scalia', 'Nicole,\_Erica\_and\_Jaclyn\_Dah 'Anaximander', 'Pierre\_Brassau', 'Nancy\_Reagan', 'Meldonium', 'Lu pe Fuentes', 'Merrick\_Garland', 'Bluetooth', 'Patty\_Duke']

```
In [86]:
         sns.lineplot(data=vewsdates['Alan Rickman'])
         plt.show()
         print('Alan Rickman passed away on Jan 14th, 2016. We capture that ev
         ent here')
```



Alan Rickman passed away on Jan 14th, 2016. We capture that event her

```
In [87]:
         sns.lineplot(data=vewsdates['Antonin Scalia'])
         plt.show()
         print('Supreme Court Justice Antonin Scalia passed away on Feb 13th,
          2016. We capture that event here as well')
```



Supreme Court Justice Antonin Scalia passed away on Feb 13th, 2016. W e capture that event here as well

Cool!! Here's the idea now: to correlate these articles with news events, I need to find the news articles that are 'closer' to each title/wiki article, then pull out the dates... no?

In addition, we can also see what topics draw attention to wikipedia (probably politics doesn't, deaths seem to do...)

In [ ]: