

In [1]:

```
from googleapiclient.discovery import build
import numpy as np
import pandas as pd
import pprint
from dateutil import parser
import isodate
import statistics

import warnings
warnings.filterwarnings("ignore")

import matplotlib.pyplot as plt
import matplotlib.ticker as ticker
import seaborn as sns
sns.set(style="darkgrid", color_codes=True)
```

In [2]:

```
pd.options.display.float_format = '{:.4f}'.format #to not get scientific formatting in pan
```

In [3]:

```
api_key = 'AIzaSyCvPxELANzObsF1o0Wm_8cVip3MjqBd2rI' #to be hidden while sending to someone
```

In [4]:

```
channel_ids = ['UCVOTBwF0vnSxMRIbfSE_K_g'] #can include more channels here
```

In [5]:

```

api_service_name = "youtube"
api_version = "v3"
#     client_secrets_file = "YOUR_CLIENT_SECRET_FILE.json"

    # Get credentials and create an API client
#     flow = google_auth_oauthlib.flow.InstalledAppFlow.from_client_secrets_file(
#         client_secrets_file, scopes)
#     credentials = flow.run_console()
youtube = build(
    api_service_name, api_version, credentials=credentials)
api_service_name, api_version, developerKey=api_key)

request = youtube.channels().list(
    part="snippet,contentDetails,statistics",
    id=''.join(channel_ids)
)
response = request.execute()

pprint.pprint(response)

```

```

{'etag': 'AwgKvB8CdZqN5abtnwAu-zc7nzc',
 'items': [{'contentDetails': {'relatedPlaylists': {'likes': '',
                                                 'uploads': 'UUVOTBwF0vnS
xMRIbfSE_K_g'}},
            'etag': 'ZT8D6F4zon48ZC08cq4mIGz_Tew',
            'id': 'UCVOTBwF0vnSxMRIbfSE_K_g',
            'kind': 'youtube#channel',
            'snippet': {'country': 'IN',
                        'customUrl': '@labourlawadvisor',
                        'description': 'Labour Laws | Personal Finance | '
                                      'Taxation | Investment for employees
\n',
                        'localized': {'description': 'Labour Laws | Personal
Finance | Taxation | '
                                      'Investment for '
                                      'employees \n',
                                      'title': 'Labour Laws | Personal
Finance | Taxation | '
                                      'Investment for employees \n',
                                      'thumbnails': {'medium': {'url': 'https://yt3.ggpht.com/ytc/...
                                      'width': 120,
                                      'height': 120}}}}}}}

```

```

        'hr@lla.in\n',
        'title': 'Labour Law Advisor'},
      'publishedAt': '2017-08-12T09:53:22Z',
      'thumbnails': {'default': {'height': 88,
                                  'url': 'https://yt3.ggpht.co
t.com/CVvE7vApeq2jgHhty_LsDBVJPnp-msvs7r3spAZo_14T_nBqd1CWTjhUdjg1TTAzt07M0x
u2=s88-c-k-c0x00fffff-no-rj',
                                  'width': 88},
                     'high': {'height': 800,
                               'url': 'https://yt3.ggpht.co
m/CVvE7vApeq2jgHhty_LsDBVJPnp-msvs7r3spAZo_14T_nBqd1CWTjhUdjg1TTAzt07M0xu2=s
800-c-k-c0x00fffff-no-rj',
                               'width': 800},
                     'medium': {'height': 240,
                                'url': 'https://yt3.ggpht.co
com/CVvE7vApeq2jgHhty_LsDBVJPnp-msvs7r3spAZo_14T_nBqd1CWTjhUdjg1TTAzt07M0xu2=s
240-c-k-c0x00fffff-no-rj',
                                'width': 240}},
        'title': 'Labour Law Advisor'},
      'statistics': {'hiddenSubscriberCount': False,
                     'subscriberCount': '3930000',
                     'videoCount': '914',
                     'viewCount': '845002134'}}],
    'kind': 'youtube#channelListResponse',
    'pageInfo': {'resultsPerPage': 5, 'totalResults': 1}}
}

```

In [6]:

```

def get_channel_stats(youtube, channel_ids):

    all_data = []

    request = youtube.channels().list(
        part="snippet,contentDetails,statistics",
        id=','.join(channel_ids)
    )
    response = request.execute()

    # Loop through items
    for item in response['items']:
        data = {'channelName': item['snippet']['title'],
                'subscribers': item['statistics']['subscriberCount'],
                'views': item['statistics']['viewCount'],
                'totalVideos': item['statistics']['videoCount'],
                'playlistId': item['contentDetails']['relatedPlaylists']['uploads']
        }
        all_data.append(data)

    return(pd.DataFrame(all_data))
}

```

In [7]:

```
channel_stats = get_channel_stats(youtube, channel_ids)
print(channel_stats)

    channelName subscribers      views totalVideos \
0  Labour Law Advisor     3930000  845002134      914

    playlistId
0  UUVOTBwF0vnSxMRIbfSE_K_g
```

In [8]:

```
views_per_video = int(channel_stats['views'][0])/int(channel_stats['totalVideos'][0])
print(round(views_per_video,2))
subs_per_video = int(channel_stats['subscribers'][0])/int(channel_stats['totalVideos'][0])
print(round(subs_per_video,2))
views_per_sub = int(channel_stats['views'][0])/int(channel_stats['subscribers'][0])
print(round(views_per_sub,2))
```

924509.99  
4299.78  
215.01

In [9]:

```
deep_dive = pd.DataFrame({'Views/Sub' : round(views_per_sub,2) , 'Subs/Video' : round(subs_
```

Out[9]:

	Views/Sub	Subs/Video	Views/Video
0	215.0100	4299.7800	924509.9900

In [10]:

```
playlist_id = list(channel_stats['playlistId'])[0]

def get_video_ids(youtube, playlist_id):

    video_ids = []

    request = youtube.playlistItems().list(
        part="snippet,contentDetails",
        playlistId=playlist_id,
        maxResults = int(list(channel_stats['totalVideos'])[0]))
    )
    response = request.execute()

    for item in response['items']:
        video_ids.append(item['contentDetails']['videoId'])

    next_page_token = response.get('nextPageToken')
    while next_page_token is not None:
        request = youtube.playlistItems().list(
            part='contentDetails',
            playlistId = playlist_id,
            maxResults = int(list(channel_stats['totalVideos'])[0]),
            pageToken = next_page_token)
        response = request.execute()

        for item in response['items']:
            video_ids.append(item['contentDetails']['videoId'])

        next_page_token = response.get('nextPageToken')

    return video_ids
```

In [11]:

```
video_ids = get_video_ids(youtube, list(channel_stats['playlistId'])[0])
```

In [12]:

```
len(video_ids)
```

Out[12]:

913

In [13]:

```
def get_video_details(youtube, video_ids):

    all_video_info = []

    for i in range(0, len(video_ids), 50):
        request = youtube.videos().list(
            part="snippet,contentDetails,statistics",
            id = ','.join(video_ids[i:i+50])
        )
        response = request.execute()

    for video in response['items']:
        stats_to_keep = {'snippet': ['channelTitle', 'title', 'description', 't
                                    'statistics': ['viewCount', 'likeCount', 'commentCount'],
                                    'contentDetails': ['duration', 'definition', 'caption']
                                    ]
        }
        video_info = {}
        video_info['video_id'] = video['id']

        for k in stats_to_keep.keys():
            for v in stats_to_keep[k]:
                try:
                    video_info[v] = video[k][v]
                except:
                    video_info[v] = None

        all_video_info.append(video_info)
    return pd.DataFrame(all_video_info)
```

In [14]:

```
video_df = get_video_details(youtube, video_ids)
video_df.head()
```

Out[14]:

	video_id	channelTitle	title	description	tags	publishedAt	viewCount	likeCount
0	70JHBff89Ko	Labour Law Advisor	Insurance ka Loop Hole! #LLAShorts 501	Open Zerodha A/c, start investing:\nhttps://li...	[llla, lla shorts, youtube shorts, shorts, yt s...	2023-01-15T13:30:03Z	77553	132
1	6gi3BdX56ZY	Labour Law Advisor	EMI maaf #LLAShorts 500	Open Zerodha A/c, start investing:\nhttps://li...	[llla, lla shorts, youtube shorts, shorts, yt s...	2023-01-14T13:30:02Z	114578	136
2	Dh5wC-xNH80	Labour Law	Art of Emotional Marketing	Open Zerodha A/c, start	[llla, lla shorts, youtube	2023-01-	686935	645

In [15]:

```
video_df.shape
```

Out[15]:

```
(913, 13)
```

In [16]:

```
if video_df.shape[0] == len(video_ids):
    print("Data properly fetched")
else:
    print("Data not properly fetched.")
```

```
Data properly fetched
```

## Data pre-processing:

In [17]:

```
video_df.isnull().any()
```

Out[17]:

```
video_id      False
channelTitle  False
title         False
description   False
tags          True
publishedAt   False
viewCount     False
likeCount     False
commentCount  False
dislikeCount  True
duration      False
definition    False
caption       False
dtype: bool
```

In [18]:

```
video_df.dtypes
```

Out[18]:

```
video_id      object
channelTitle   object
title          object
description    object
tags           object
publishedAt   object
viewCount      object
likeCount      object
commentCount   object
dislikeCount   object
duration       object
definition     object
caption        object
dtype: object
```

In [19]:

```
# Convert count columns to numeric
numeric_cols = ['viewCount', 'likeCount', 'commentCount', 'dislikeCount']
video_df[numeric_cols] = video_df[numeric_cols].apply(pd.to_numeric, errors = 'coerce', axis=0)
```

In [20]:

```
# Publish day in the week
video_df['publishedAt'] = video_df['publishedAt'].apply(lambda x: parser.parse(x))
video_df['pushblishDayName'] = video_df['publishedAt'].apply(lambda x: x.strftime("%A"))
```

In [21]:

```
# convert duration to seconds
video_df['durationSecs'] = video_df['duration'].apply(lambda x: isodate.parse_duration(x))
video_df['durationSecs'] = video_df['durationSecs'].astype('timedelta64[s]')
video_df[['durationSecs', 'duration']]
```

Out[21]:

	durationSecs	duration
0	60.0000	PT1M
1	60.0000	PT1M
2	60.0000	PT1M
3	60.0000	PT1M
4	60.0000	PT1M
...	...	...
908	360.0000	PT6M
909	232.0000	PT3M52S
910	603.0000	PT10M3S
911	332.0000	PT5M32S
912	354.0000	PT5M54S

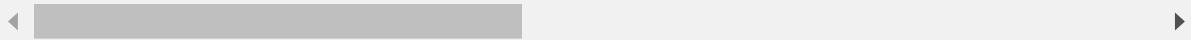
913 rows × 2 columns

In [22]:

```
# Add tag count
video_df['tagCount'] = video_df['tags'].apply(lambda x: 0 if x is None else len(x))
video_df.head()
```

Out[22]:

	video_id	channelTitle	title	description	tags	publishedAt	v
0	70JHBff89Ko	Labour Law Advisor	Insurance ka Loop Hole! #LLAShorts 501	Open Zerodha A/c, start investing:\nhttps://li...	[Ila, Ila shorts, youtube shorts, shorts, yt s...	2023-01-15 13:30:03+00:00	71
1	6gi3BdX56ZY	Labour Law Advisor	EMI maaf #LLAShorts 500	Open Zerodha A/c, start investing:\nhttps://li...	[Ila, Ila shorts, youtube shorts, shorts, yt s...	2023-01-14 13:30:02+00:00	114
2	Db5wC-xNH80	Labour Law Advisor	Art of Emotional Marketing #LLAShorts 499	Open Zerodha A/c, start investing:\nhttps://li...	[Ila, Ila shorts, youtube shorts, shorts, yt s...	2023-01-13 15:37:36+00:00	686
3	MCajCb755PU	Labour Law Advisor	Why is Bluetooth called "Bluetooth"? #LLAShort...	Open Zerodha A/c, start investing:\nhttps://li...	[Ila, Ila shorts, youtube shorts, shorts, yt s...	2023-01-12 15:51:57+00:00	311
4	dgmolqupxGA	Labour Law Advisor	BP Ki Pill hai, Paneer tikka nahi! #LLAShorts 497	Insurance Samadhan : http://bit.ly/3IB5wpP\n....	[Ila, Ila shorts, youtube shorts, shorts, yt s...	2023-01-11 13:41:35+00:00	1431



In [23]:

```
# Comments and Likes per 1000 view ratio
video_df['likeToViewRatio'] = video_df['likeCount']/ video_df['viewCount'] * 1000
video_df['commentToViewRatio'] = video_df['commentCount']/ video_df['viewCount'] * 1000
# video_df['dislikeToViewRatio'] = video_df['LikeCount']/ video_df['viewCount'] * 1000
# video_df['LikeToDislikeRatio'] = video_df['LikeCount']/ video_df['dislikeCount'] * 1000
video_df.head()
```

Out[23]:

	video_id	channelTitle	title	description	tags	publishedAt	viewCount
0	70JHBff89Ko	Labour Law Advisor	Insurance ka Loop Hole! #LLAShorts 501	Open Zerodha A/c, start investing:\nhttps://li...	[Ila, Ila shorts, youtube shorts, shorts, yt s...]	2023-01-15 13:30:03+00:00	77553.0000 1
1	6gi3BdX56ZY	Labour Law Advisor	EMI maaf #LLAShorts 500	Open Zerodha A/c, start investing:\nhttps://li...	[Ila, Ila shorts, youtube shorts, shorts, yt s...]	2023-01-14 13:30:02+00:00	114578.0000 1
2	Dh5wC-xNH80	Labour Law	Art of Emotional Marketing	Open Zerodha A/c, start	[Ila, Ila shorts, youtube]	2023-01-13	686935.0000 6

In [24]:

```
#Marking the shorts and Long format videos
video_df['type'] = np.where(video_df['durationSecs']<=60, 'shorts', 'long_video')
video_df.head()
```

Out[24]:

	video_id	channelTitle	title	description	tags	publishedAt	viewCount
0	70JHBff89Ko	Labour Law Advisor	Insurance ka Loop Hole! #LLAShorts 501	Open Zerodha A/c, start investing:\nhttps://li...	[Ila, Ila shorts, youtube shorts, shorts, yt s...]	2023-01-15 13:30:03+00:00	77553.0000 1
1	6gi3BdX56ZY	Labour Law Advisor	EMI maaf #LLAShorts 500	Open Zerodha A/c, start investing:\nhttps://li...	[Ila, Ila shorts, youtube shorts, shorts, yt s...]	2023-01-14 13:30:02+00:00	114578.0000 1
2	Dh5wC-xNH80	Labour Law	Art of Emotional Marketing	Open Zerodha A/c, start	[Ila, Ila shorts, youtube]	2023-01-13	686935.0000 6

In [25]:

```
#calculating the engagement each video gets
```

```
video_df['engagementScore'] = ((video_df['likeCount']+video_df['commentCount'])/int(channel
video_df.head()
```

Out[25]:

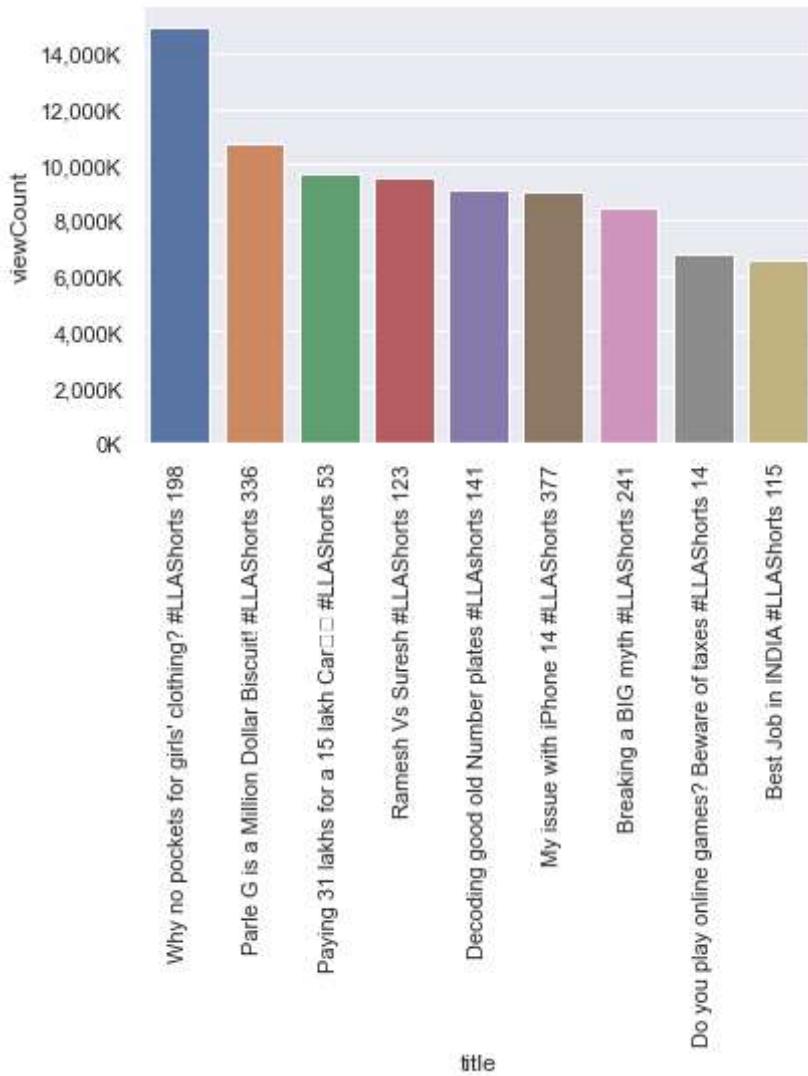
	video_id	channelTitle	title	description	tags	publishedAt	v
0	70JHBff89Ko	Labour Law Advisor	Insurance ka Loop Hole! #LLAShorts 501	Open Zerodha A/c, start investing:\nhttps://li...	[llla, lla shorts, youtube shorts, shorts, yt s...	2023-01-15 13:30:03+00:00	71
1	6gi3BdX56ZY	Labour Law Advisor	EMI maaf #LLAShorts 500	Open Zerodha A/c, start investing:\nhttps://li...	[llla, lla shorts, youtube shorts, shorts, yt s...	2023-01-14 13:30:02+00:00	114
2	Db5wC-xNH80	Labour Law Advisor	Art of Emotional Marketing #LLAShorts 499	Open Zerodha A/c, start investing:\nhttps://li...	[llla, lla shorts, youtube shorts, shorts, yt s...	2023-01-13 15:37:36+00:00	686
3	MCajCb755PU	Labour Law Advisor	Why is Bluetooth called "Bluetooth"? #LLAShort...	Open Zerodha A/c, start investing:\nhttps://li...	[llla, lla shorts, youtube shorts, shorts, yt s...	2023-01-12 15:51:57+00:00	311
4	dgmolqupxGA	Labour Law Advisor	BP Ki Pill hai, Paneer tikka nahi! #LLAShorts 497	Insurance Samadhan : http://bit.ly/3IB5wpP\n....	[llla, lla shorts, youtube shorts, shorts, yt s...	2023-01-11 13:41:35+00:00	1431

## EDA

### Best performing videos

In [26]:

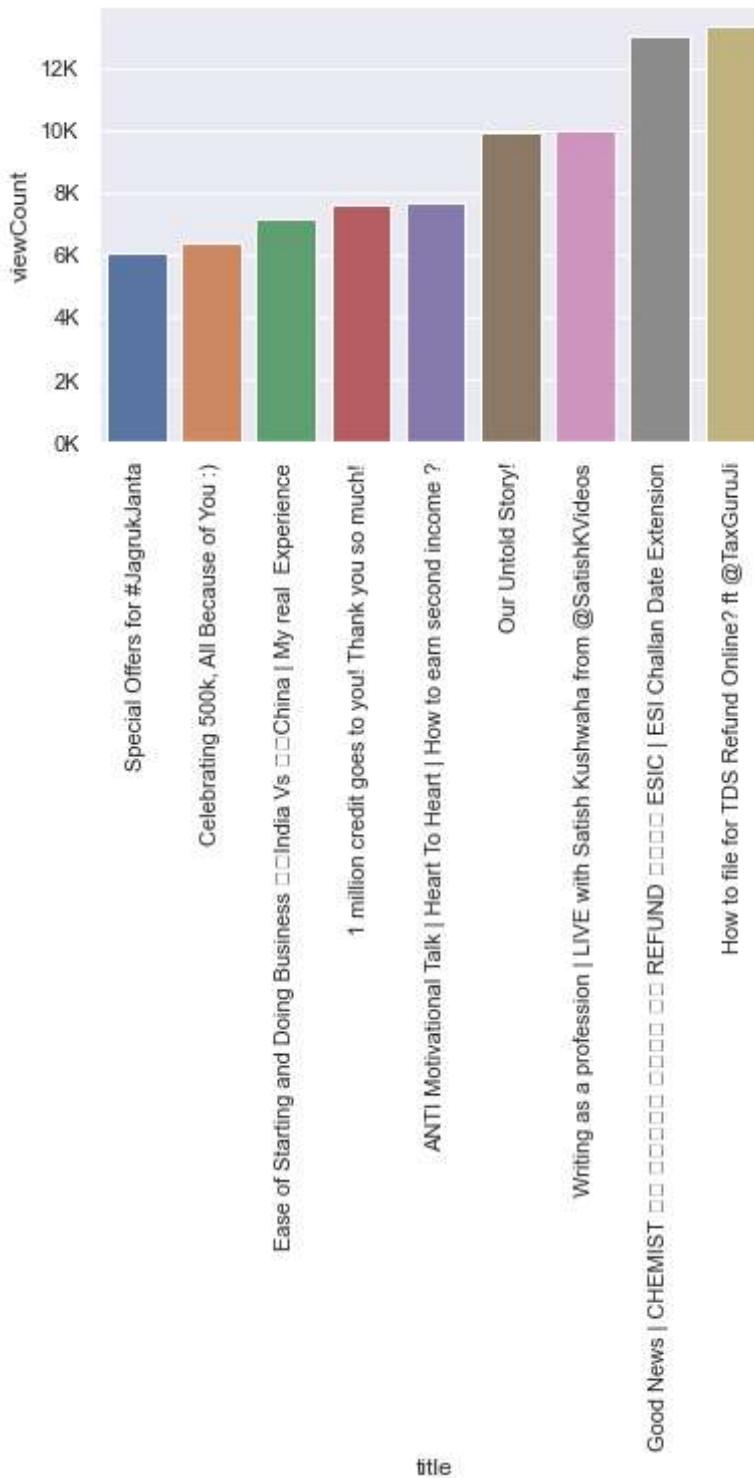
```
with sns.axes_style("darkgrid"):
    ax = sns.barplot(x = 'title', y = 'viewCount', data = video_df.sort_values('viewCount',
    plot = ax.set_xticklabels(ax.get_xticklabels(), rotation=90)
    ax.yaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:, .0f}'.format(x/1000
sns.set_theme()
```



## Worst performing videos

In [27]:

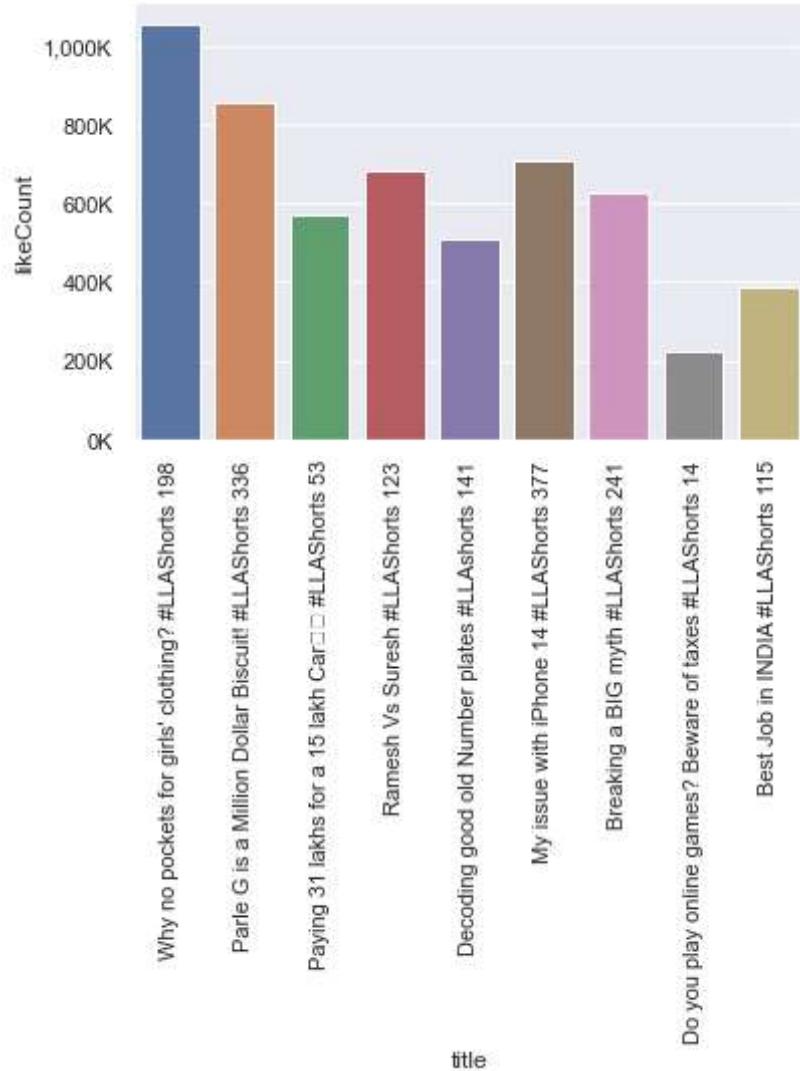
```
with sns.axes_style("darkgrid"):
    ax = sns.barplot(x = 'title', y = 'viewCount', data = video_df.sort_values('viewCount',
    plot = ax.set_xticklabels(ax.get_xticklabels(), rotation=90)
    ax.yaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:.0f}'.format(x/1000
```



## Most Liked Videos

In [28]:

```
with sns.axes_style("darkgrid"):
    ax = sns.barplot(x = 'title', y = 'likeCount', data = video_df.sort_values('viewCount',
    plot = ax.set_xticklabels(ax.get_xticklabels(), rotation=90)
    ax.yaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:, .0f}'.format(x/1000
sns.set_theme()
```



## Most Disliked Videos

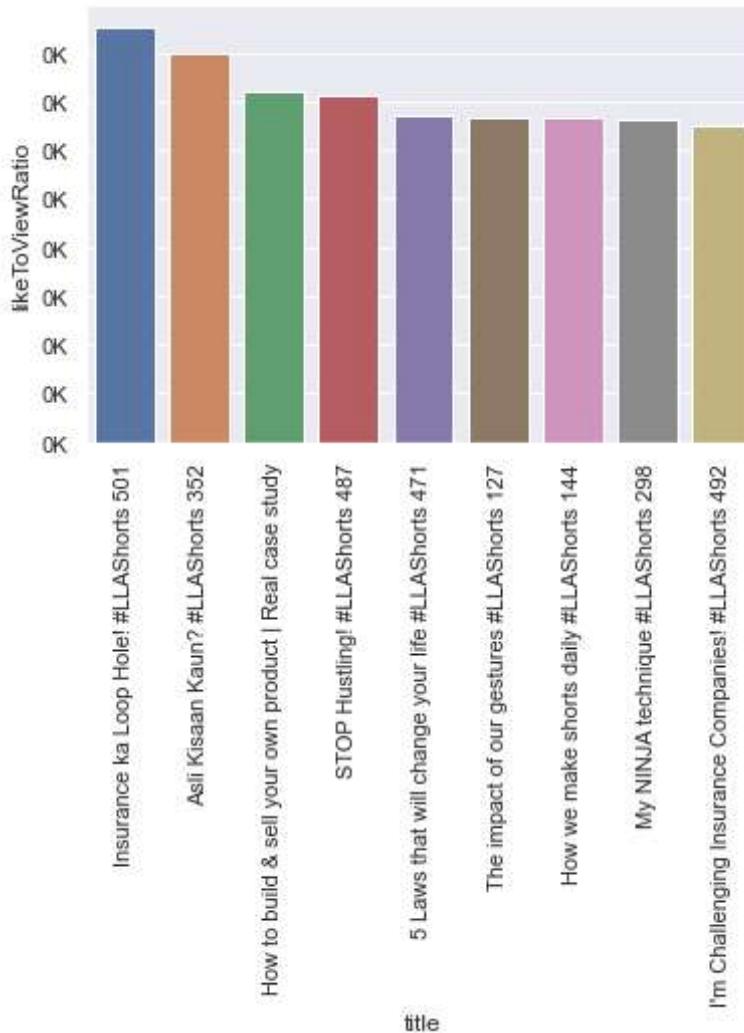
In [29]:

```
# with sns.axes_style("darkgrid"):
#     ax = sns.barplot(x = 'title', y = 'dislikeCount', data = video_df.sort_values('viewCo
#     plot = ax.set_xticklabels(ax.get_xticklabels(), rotation=90)
#     ax.yaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:, .0f}'.format(x/10
#     sns.set_theme()
```

## Video with highest likes per 1000 views

In [30]:

```
with sns.axes_style("darkgrid"):
    ax = sns.barplot(x = 'title', y = 'likeToViewRatio', data = video_df.sort_values('likeToViewRatio', ascending=False))
    plot = ax.set_xticklabels(ax.get_xticklabels(), rotation=90)
    ax.yaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:, .0f}'.format(x/1000)))
    sns.set_theme()
```



## Video with highest dislikes per 1000 views

In [31]:

```
# with sns.axes_style("darkgrid"):
#     ax = sns.barplot(x = 'title', y = 'dislikeToViewRatio', data = video_df.sort_values('dislikeToViewRatio', ascending=False))
#     plot = ax.set_xticklabels(ax.get_xticklabels(), rotation=90)
#     ax.yaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:, .0f}'.format(x/1000)))
#     sns.set_theme()
```

## Video with highest likes per 1000 dislikes

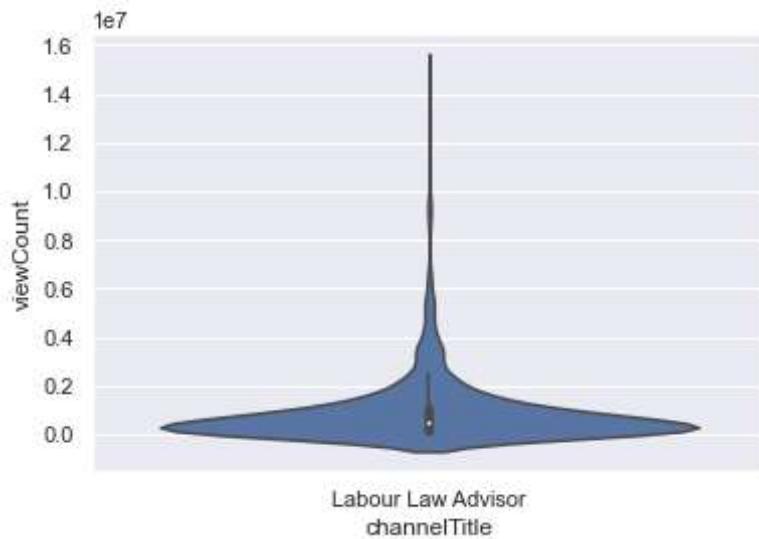
In [32]:

```
# with sns.axes_style("darkgrid"):
#     ax = sns.barplot(x = 'title', y = 'LikeToDislikeRatio', data = video_df.sort_values('
# plot = ax.set_xticklabels(ax.get_xticklabels(), rotation=90)
# ax.yaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:, .0f}'.format(x/10
# sns.set_theme()
```

## View distribution per video

In [33]:

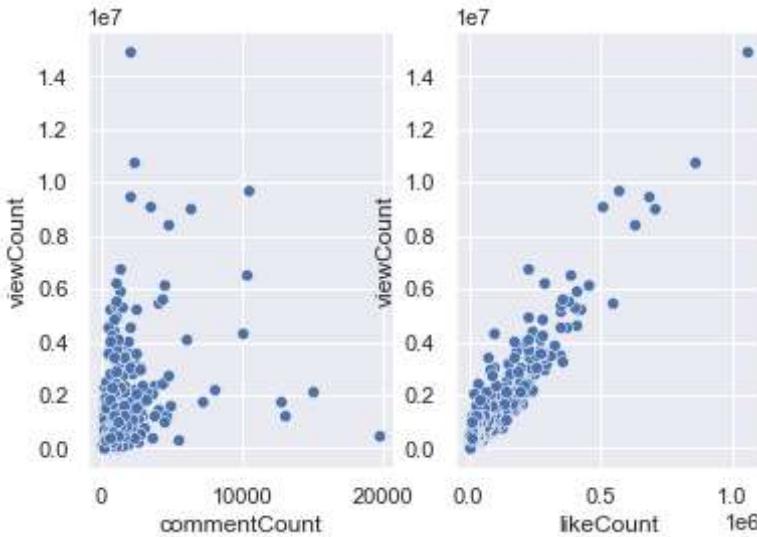
```
with sns.axes_style("darkgrid"):
    sns.violinplot(video_df['channelTitle'], video_df['viewCount'])
```



## Views vs. likes and comments

In [34]:

```
with sns.axes_style("darkgrid"):
    fig, ax = plt.subplots(1,2)
    sns.scatterplot(data = video_df, x = 'commentCount', y = 'viewCount', ax = ax[0])
    sns.scatterplot(data = video_df, x = 'likeCount', y = 'viewCount', ax = ax[1])
    # ax.yaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:.0f}'.format(x/10
```



## Distribution of duration of videos

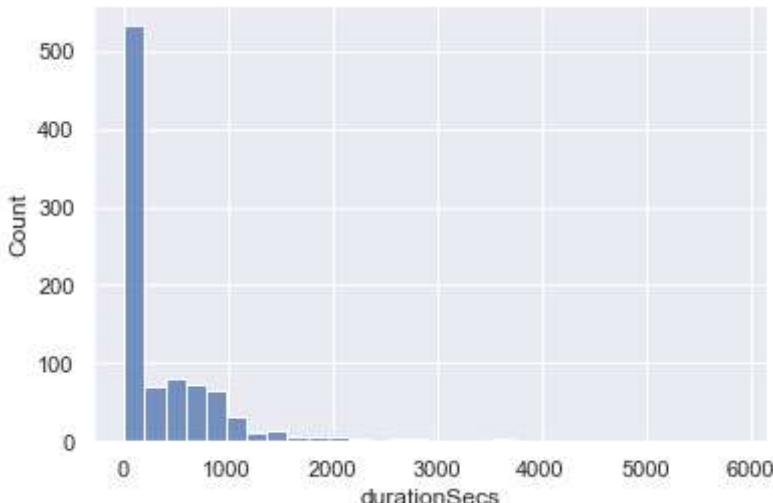
In [35]:

```
#Average duration of videos
print(str(round(statistics.mean(video_df['durationSecs']),2)) + " secs")
```

411.83 secs

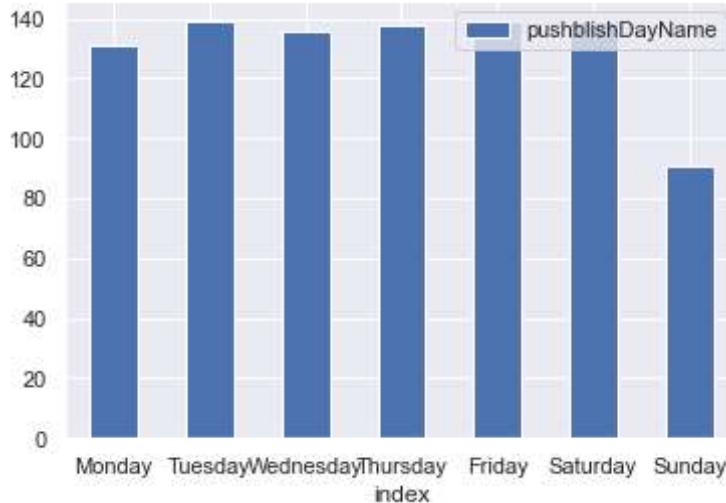
In [36]:

```
with sns.axes_style("darkgrid"):
    sns.histplot(data = video_df, x = 'durationSecs', bins=30)
```



In [37]:

```
day_df = pd.DataFrame(video_df['pushublishDayName'].value_counts())
weekdays = [ 'Monday', 'Tuesday', 'Wednesday', 'Thursday', 'Friday', 'Saturday', 'Sunday' ]
day_df = day_df.reindex(weekdays)
with sns.axes_style("darkgrid"):
    ax = day_df.reset_index().plot.bar(x='index', y='pushublishDayName', rot=0)
```

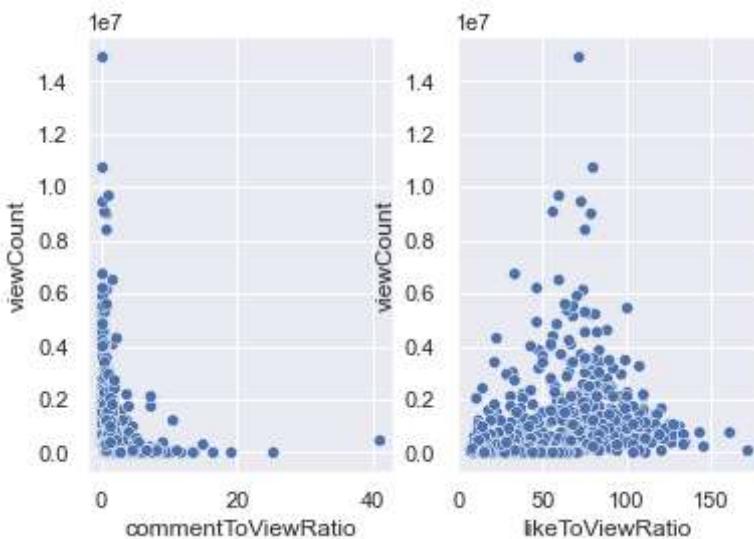


In [38]:

```
# plt.rcParams['figure.figsize'] = (18, 6)
# sns.violinplot(video_df['channelTitle'], video_df['viewCount'], palette = 'pastel')
# plt.title('Views per channel', fontsize = 14)
# plt.show()
```

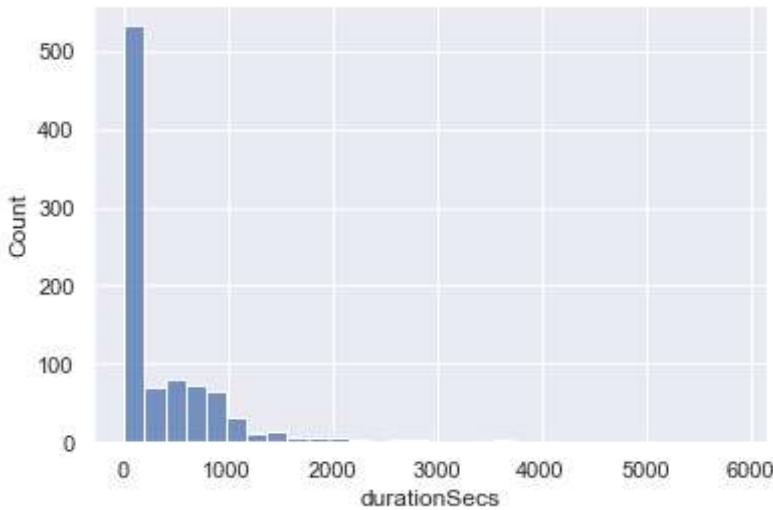
In [39]:

```
with sns.axes_style("darkgrid"):
    fig, ax = plt.subplots(1,2)
    sns.scatterplot(data = video_df, x = "commentToViewRatio", y = "viewCount", ax=ax[0])
    sns.scatterplot(data = video_df, x = "likeToViewRatio", y = "viewCount", ax=ax[1])
```



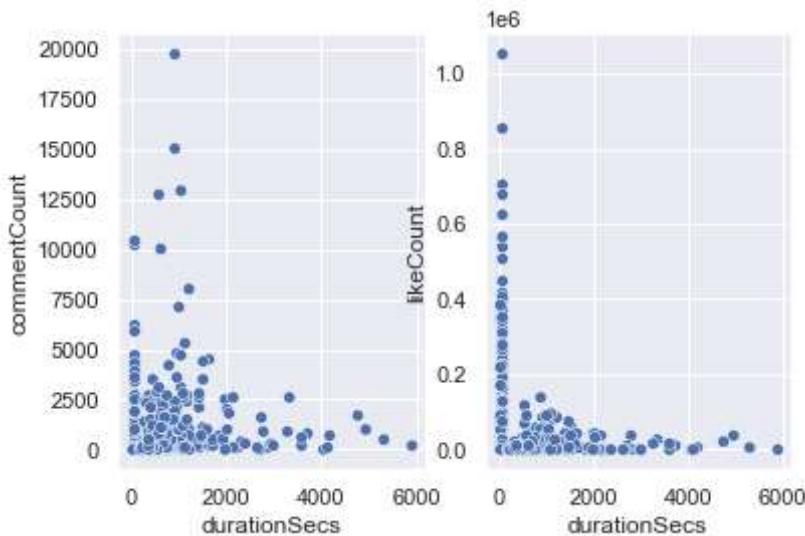
In [40]:

```
with sns.axes_style("darkgrid"):
    sns.histplot(data=video_df[video_df['durationSecs'] < 10000], x="durationSecs", bins=30)
```



In [41]:

```
with sns.axes_style("darkgrid"):
    fig, ax = plt.subplots(1,2)
    sns.scatterplot(data = video_df, x = "durationSecs", y = "commentCount", ax=ax[0])
    sns.scatterplot(data = video_df, x = "durationSecs", y = "likeCount", ax=ax[1])
```



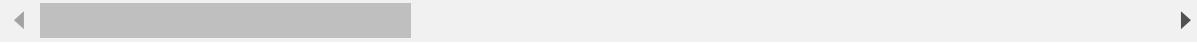
In [42]:

```
for i in video_df['title']:
    video_df['titleLength'] = video_df['title'].apply(lambda x: len(x.split()))
video_df.head()
```

Out[42]:

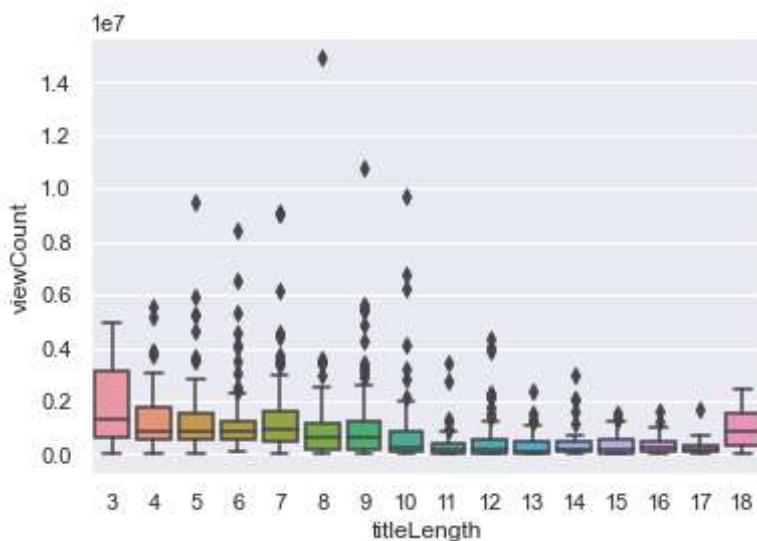
	video_id	channelTitle	title	description	tags	publishedAt	v
0	70JHBff89Ko	Labour Law Advisor	Insurance ka Loop Hole! #LLAShorts 501	Open Zerodha A/c, start investing:\nhttps://li...	[llla, lla shorts, youtube shorts, shorts, yt s...]	2023-01-15 13:30:03+00:00	71
1	6gi3BdX56ZY	Labour Law Advisor	EMI maaf #LLAShorts 500	Open Zerodha A/c, start investing:\nhttps://li...	[llla, lla shorts, youtube shorts, shorts, yt s...]	2023-01-14 13:30:02+00:00	114
2	Db5wC-xNH80	Labour Law Advisor	Art of Emotional Marketing #LLAShorts 499	Open Zerodha A/c, start investing:\nhttps://li...	[llla, lla shorts, youtube shorts, shorts, yt s...]	2023-01-13 15:37:36+00:00	686
3	MCajCb755PU	Labour Law Advisor	Why is Bluetooth called "Bluetooth"? #LLAShorts...	Open Zerodha A/c, start investing:\nhttps://li...	[llla, lla shorts, youtube shorts, shorts, yt s...]	2023-01-12 15:51:57+00:00	311
4	dgmolqupxGA	Labour Law Advisor	BP Ki Pill hai, Paneer tikka nahi! #LLAShorts 497	Insurance Samadhan : http://bit.ly/3IB5wpP\n.....	[llla, lla shorts, youtube shorts, shorts, yt s...]	2023-01-11 13:41:35+00:00	1431

5 rows × 21 columns



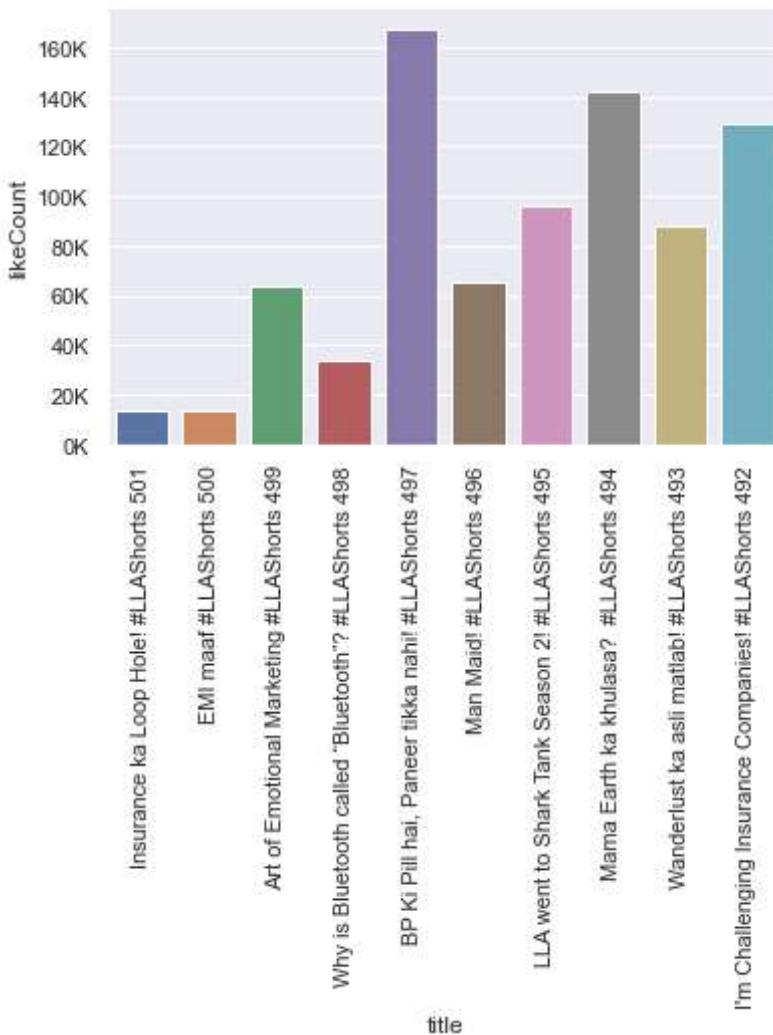
In [43]:

```
with sns.axes_style("darkgrid"):
    sns.boxplot(data = video_df, x = "titleLength", y = "viewCount")
```



In [44]:

```
with sns.axes_style("darkgrid"):
    ax = sns.barplot(x = 'title', y = 'likeCount', data = video_df.head(10))
    plot = ax.set_xticklabels(ax.get_xticklabels(), rotation=90)
    ax.yaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:, .0f}'.format(x/1000)))
    sns.set_theme()
```



## Now, let's dig a bit deeper by looking at shorts and long videos separately

In [45]:

```
lv = video_df[video_df['type']=='long_video']
sv = video_df[video_df['type']=='shorts']
```

In [46]:

```
type(lv.shape[0])
```

Out[46]:

```
int
```

In [47]:

```
sv.shape
```

Out[47]:

```
(525, 21)
```

In [48]:

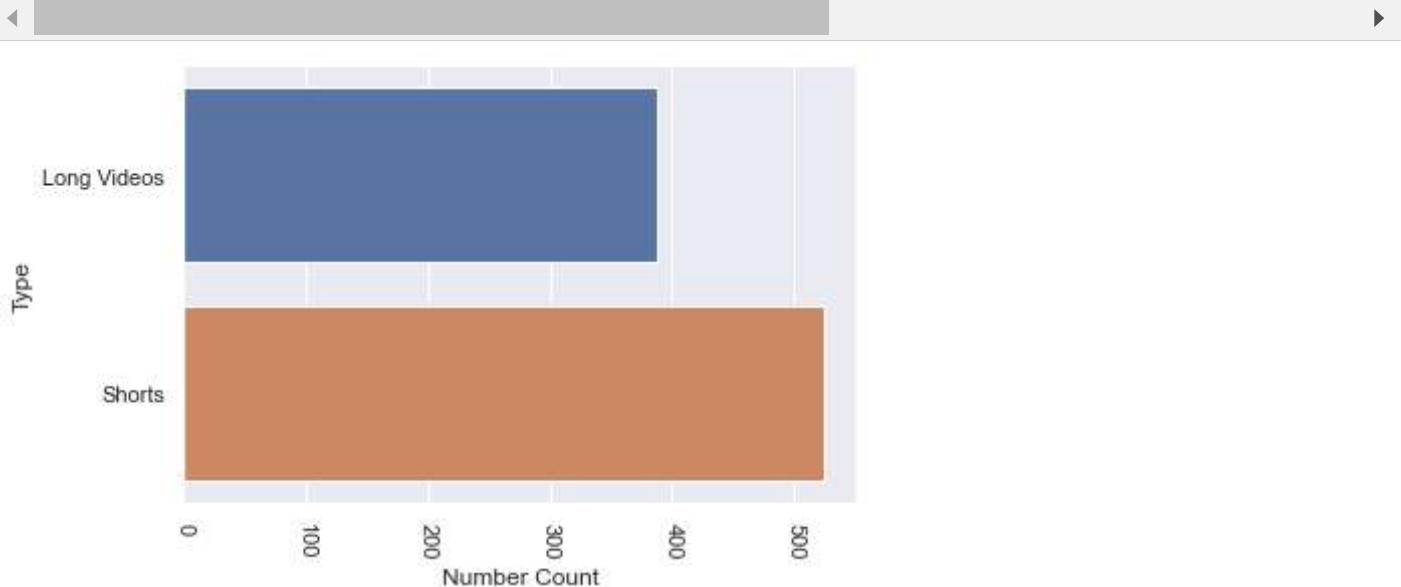
```
pd.DataFrame({'Type':['Long Videos', 'Shorts'], 'Number Count':[lv.shape[0],sv.shape[0]]})
```

Out[48]:

	Type	Number Count
0	Long Videos	388
1	Shorts	525

In [49]:

```
with sns.axes_style("darkgrid"):
    ax = sns.barplot(y = 'Type', x = 'Number Count', data = pd.DataFrame({'Type':['Long Vid
plot = ax.set_xticklabels(ax.get_xticklabels(), rotation=-90)
ax.xaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:, .0f}'.format(x)))
sns.set_theme()
```



In [50]:

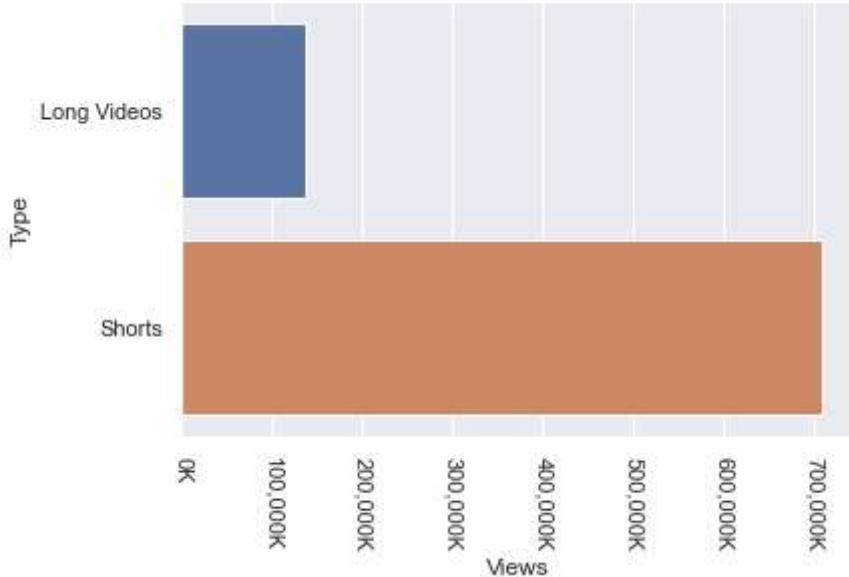
```
pd.DataFrame({'Type':['Long Videos', 'Shorts'], 'Views':[lv['viewCount'].sum(),sv['viewCoun
```

Out[50]:

	Type	Views
0	Long Videos	137552173.0000
1	Shorts	708678617.0000

In [51]:

```
with sns.axes_style("darkgrid"):
    ax = sns.barplot(y = 'Type', x = 'Views', data = pd.DataFrame({'Type': ['Long Videos', 'Shorts'], 'Views': [159864.0324, 6871403481209]}))
    plot = ax.set_xticklabels(ax.get_xticklabels(), rotation=-90)
    ax.xaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:, .0f}'.format(x/1000)))
    sns.set_theme()
```



In [52]:

```
sv['viewCount'].sum() / lv['viewCount'].sum()
```

Out[52]:

5.152071403481209

In [53]:

```
print(f"Shorts are performing {round(sv['viewCount'].sum() / lv['viewCount'].sum(), 2)} times better than long videos in terms of views.")
```

Shorts are performing 5.15 times better than long videos in terms of views.

In [54]:

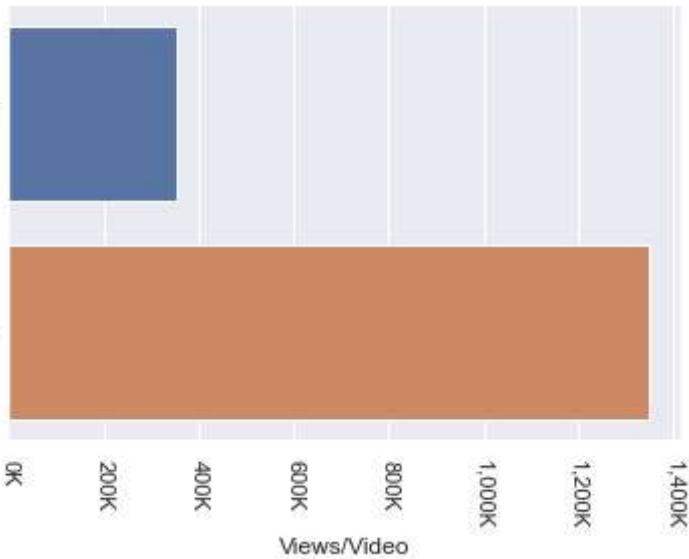
```
# On the flip side, let's check if that's the case when we look at them separately
pd.DataFrame({'Type': ['Long Videos', 'Shorts'], 'Views/Video': [lv['viewCount'].sum() / lv.shape[0], sv['viewCount'].sum() / sv.shape[0]]})
```

Out[54]:

	Type	Views/Video
0	Long Videos	354515.9098
1	Shorts	1349864.0324

In [55]:

```
with sns.axes_style("darkgrid"):
    ax = sns.barplot(y = 'Type', x = 'Views/Video', data = pd.DataFrame({'Type': ['Long Videos', 'Shorts'], 'Views/Video': [300000, 1300000]}))
    plot = ax.set_xticklabels(ax.get_xticklabels(), rotation=-90)
    ax.xaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:, .0f}'.format(x/1000)))
    sns.set_theme()
```



In [56]:

```
video_df.columns
```

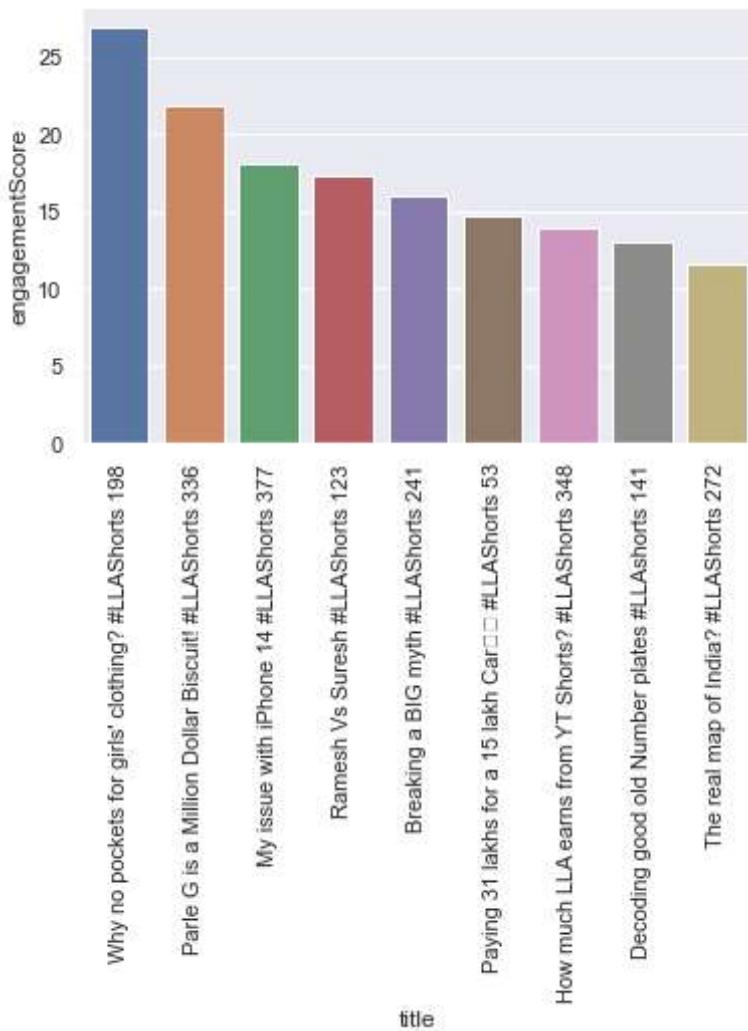
Out[56]:

```
Index(['video_id', 'channelTitle', 'title', 'description', 'tags',
       'publishedAt', 'viewCount', 'likeCount', 'commentCount', 'dislikeCount',
       'duration', 'definition', 'caption', 'pushblishDayName', 'durationSeconds',
       'tagCount', 'likeToViewRatio', 'commentToViewRatio', 'type',
       'engagementScore', 'titleLength'],
      dtype='object')
```

## Top 10 videos by engagement score

In [57]:

```
with sns.axes_style("darkgrid"):
    ax = sns.barplot(x = 'title', y = 'engagementScore', data = video_df.sort_values('engagementScore', ascending=False))
    plot = ax.set_xticklabels(ax.get_xticklabels(), rotation=90)
#    ax.yaxis.set_major_formatter(ticker.FuncFormatter(lambda x, pos:'{:, .0f}'.format(x/10)))
sns.set_theme()
```



In [58]:

```
video_df['publishedAt'] = video_df['publishedAt'].dt.tz_localize(None)
lv['publishedAt'] = video_df['publishedAt'].dt.tz_localize(None)
sv['publishedAt'] = video_df['publishedAt'].dt.tz_localize(None)
```

In [59]:

```
writer = pd.ExcelWriter('viz_data.xlsx', engine='xlsxwriter')
```

In [60]:

```
video_df.to_excel(writer, sheet_name='all videos')
lv.to_excel(writer, sheet_name='long videos')
sv.to_excel(writer, sheet_name='shorts')
```

In [61]:

```
writer.close()
```