

Youtube数据挖掘

1.引包

```
import pandas as pd
import numpy as np
import seaborn as sns
import matplotlib.pyplot as plt
import matplotlib as mpl
import os
from subprocess import check_output
from wordcloud import WordCloud, STOPWORDS
```

2. 数据引入

```
df_youtube_us = pd.read_csv("archive/USvideos.csv")
```

3.数据摘要

3.1 数据示例

```
df_youtube_us.head()
```

| | video_id | trending_date | title | channel_title | category_id | publish_time | tags | views |
|---|-------------|---------------|---|-----------------------|-------------|--------------------------|---|---------|
| 0 | 2kyS6SvSYSE | 17.14.11 | WE WANT TO TALK ABOUT OUR MARRIAGE | CaseyNeistat | 22 | 2017-11-13T17:13:01.000Z | SHANtell martin | 748374 |
| 1 | 1ZAPwfrtAFY | 17.14.11 | The Trump Presidency: Last Week Tonight with J... | LastWeekTonight | 24 | 2017-11-13T07:30:00.000Z | last week tonight trump presidency "last week ... | 2418783 |
| 2 | 5qpjK5DgCt4 | 17.14.11 | Racist Superman Rudy Mancuso, King Bach & Le... | Rudy Mancuso | 23 | 2017-11-12T19:05:24.000Z | racist superman "rudy" "mancuso" "king" "bach"... | 3191434 |
| 3 | puqaWrEC7tY | 17.14.11 | Nickelback Lyrics: Real or Fake? | Good Mythical Morning | 24 | 2017-11-13T11:00:04.000Z | rhett and link "gmm" "good mythical morning" "... | 343168 |
| 4 | d380meD0W0M | 17.14.11 | I Dare You: GOING BALD!? | nigahiga | 24 | 2017-11-12T18:01:41.000Z | ryan "higa" "higatv" "nigahiga" "i dare you" "... | 2095731 |

3.2 数据总个数

```
df_youtube_us.shape
```

```
(40949, 16)
```

3.3 数据频数

3.3.1 各属性的独立数据个数

```
for column_name in df_youtube_us:
    print("-----分割线-----")
    print("%s的总描述:\n"%(column_name),df_youtube_us[column_name].describe())
    print("%s的每个值的频次:\n"%(column_name),df_youtube_us[column_name].value_counts())
```

```
-----分割线-----
video_id的总描述:
  count      40949
  unique      6351
  top      j4KvrAUjn6c
  freq         30
Name: video_id, dtype: object
video_id的每个值的频次:
  j4KvrAUjn6c      30
  MAjY8mCTXWk      29
  r-3iathMo7o      29
  NBSAQenU2Bk      29
  QBL8IRJ5yHU      29
  ..
  2X5fG1A4kuc       1
  A8QY1IRPGTY       1
  zYWt2mna1P8       1
  yW60RWYn3g0       1
  uf0nBRXy3Pc       1
Name: video_id, Length: 6351, dtype: int64
-----分割线-----
trending_date的总描述:
  count      40949
  unique       205
  top      18.05.06
  freq         200
Name: trending_date, dtype: object
trending_date的每个值的频次:
  18.05.06      200
  18.03.06      200
  18.11.06      200
  17.13.12      200
  18.07.05      200
  ...
  18.01.02      197
  18.31.01      197
  18.02.02      196
  18.03.02      196
  18.04.02      196
Name: trending_date, Length: 205, dtype: int64
-----分割线-----
title的总描述:
  count      40949
  unique      6455
  top      WE MADE OUR MOM CRY...HER DREAM CAME TRUE!
  freq         30
Name: title, dtype: object
title的每个值的频次:
  WE MADE OUR MOM CRY...HER DREAM CAME TRUE!      30
  Why I'm So Scared (being myself and crying too much)      29
  Rooster Teeth Animated Adventures - Millie So Serious      29
  Charlie Puth - BOY [Official Audio]      29
  Mission: Impossible - Fallout (2018) - Official Trailer - Paramount Pictures      29
  ..
  Black Mirror - U.S.S. Callister | Official Trailer [HD] | Netflix      1
  2018 Winter Olympics Recap Day 11 I Part 1 I NBC Sports      1
  Fusion 360 to 3D Print Parts to Build a Desk      1
  Behind The Curtain - OFFICIAL TRAILER      1
  Natalie's 2nd Rap - SNL      1
Name: title, Length: 6455, dtype: int64
-----分割线-----
channel_title的总描述:
  count      40949
  unique      2207
  top      ESPN
  freq         203
Name: channel_title, dtype: object
channel_title的每个值的频次:
  ESPN      203
  The Tonight Show Starring Jimmy Fallon      197
  Vox      193
  Netflix      193
  TheEllenShow      193
  ...
  Dean Anderson      1
  Caterham Cars      1
  Tu Fan      1
  Super Netvid      1
  CNLoehr      1
Name: channel_title, Length: 2207, dtype: int64
```

-----分割线-----

category_id的总描述:
count 40949.000000
mean 19.972429
std 7.568327
min 1.000000
25% 17.000000
50% 24.000000
75% 25.000000
max 43.000000

Name: category_id, dtype: float64
category_id的每个值的频次:

24 9964
10 6472
26 4146
23 3457
22 3210
25 2487
28 2401
1 2345
17 2174
27 1656
15 920
20 817
19 402
2 384
29 57
43 57

Name: category_id, dtype: int64

-----分割线-----

publish_time的总描述:
count 40949
unique 6269
top 2018-05-18T14:00:04.000Z
freq 50

Name: publish_time, dtype: object

publish_time的每个值的频次:
2018-05-18T14:00:04.000Z 50
2018-05-06T13:00:05.000Z 32
2018-05-13T18:03:56.000Z 30
2018-05-14T13:00:01.000Z 29
2018-05-14T14:00:03.000Z 29

..
2017-11-15T02:17:29.000Z 1
2018-01-08T16:00:02.000Z 1
2018-02-14T11:00:00.000Z 1
2017-12-28T16:03:03.000Z 1
2017-11-24T13:00:06.000Z 1

Name: publish_time, Length: 6269, dtype: int64

-----分割线-----

tags的总描述:
count 40949
unique 6055
top [none]
freq 1535

Name: tags, dtype: object

tags的每个值的频次:

[none]

1535

ABC|"americanidol"|"idol"|"american idol"|"ryan"|"seacrest"|"ryan seacrest"|"katy"|"perry"|"katy perry"|"luke"|"bryan"|"luke bryan"|"lionel"|"richie"|"lionel richie"|"season 16"|"american idol XVI"|"television"|"ad"|"spring"|"2018"|"music"|"reality"|"competition"|"song"|"sing"|"audition"|"auditions"|"performance"|"live"|"fox"|"AI"|"hollywood"|"contestant"|"official"|"american"|"official american idol"|"hollywood week"|"hometown audition"

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Jacksfilms|"Jack Douglass"|"YGS"|"YGS 100"|"YGS 50"|"The Best of Your Grammar Sucks"|"Your Grammar Sucks"|"YIAY"|"Yesterday I Asked You"|"Fidget Spinners"|"Emoji Movie"|"Kermit Sings"|"JackAsk"|"Jack Ask"|"Dubstep Solves Everything"|"Frozen 2"|"iPhone Parody"|"Apple Parody"

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James Corden|"The Late Late Show"|"Colbert"|"late night"|"late night show"|"Stephen Colbert"|"Comedy"|"monologue"|"comedian"|"impressions"|"celebrities"|"carpool"|"karaoke"|"CBS"|"Late Late Show"|"Corden"|"joke"|"jokes"|"funny"|"funny video"|"funny videos"|"humor"|"celebrity"|"celeb"|"hollywood"|"famous"

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The Late Show|"Stephen Colbert"|"Colbert"|"Late Show"|"celebrities"|"late night"|"talk show"|"skits"|"bit"|"monologue"|"The Late Late Show"|"Late Late Show"|"letterman"|"david letterman"|"impressions"|"comedian"|"joke"|"jokes"|"funny"|"funny video"|"funny videos"|"humor"|"celebrity"|"celeb"|"hollywood"|"famous"|"James Corden"|"Corden"|"Comedy"

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First we feast|"fwf"|"firstwefeast"|"food"|"food porn"|"cook"|"cooking"|"chef"|"kitchen"|"recipe"|"cocktail"|"bartender"|"craft beer"|"complex"|"complex media"|"Cook (Profession)sean evans"|"Food Skills"|"Mark Iacono"|"Lucali"|"margherita pie"|"margherita"|"Dom DeMarco"|"beyonce and jay z lucali"|"pizza"|"brooklyn"|"ugly delicious mark Iacono"|"how to make pizza"|"how to make tomato sauce"

1

Georgia Dome|"Implosion"|"2017"|"November 20"|"The Weather Channel"|"Guy Losing It Live on Air"|"Swearing"|"MARTA"|"bus"|"ironic"|"monologue"

buzzfeed|"buzzfeedvideo"|"buzzfeed video"|"meghan markle"|"megan markle"|"prince harry"|"prince william"|"princess kate"|"kate middleton"|"royal engagement"|"royal wedding"|"princess diana"|"british"|"americans"|"london"|"princess charlotte"|"prince george"|"prince charles"|"funny"|"royal family"|"kate"|"queen elizabeth"|"uk"|"uk news"|"royals"|"wedding"|"engagement"|"harry"|"harry and meghan"|"markle"|"royal"|"prince harry and meghan markle"|"meghan"|"the royals"|"kensington palace"|"the queen"|"prince harry engagement"

1
introverts vs extroverts|"hannah"|"stocking"|"introverts"|"vs"|"extroverts"|"high school rivalry"|"how to control your boyfriend"|"dating a pathological liar"|"High School Rivalry | Hannah Stocking & Supreme
Patty"|"lelepons"|"hannahstocking"|"rudymancuso"|"inanna"|"anwar"|"sarkis"|"shots"|"shotsstudios"|"alesso"|"anitta"|"brazil"

1
tamar|"tamar braxton"|"tamar braxton vince herbert"|"tamar and vince"|"vince herbert"|"tamar braxton talk show"|"tamar vince interview"|"tamar vince season 5"|"tamar braxton marriage"|"tamar vince divorce"|"tamar chronicles"|"the braxtons"|"braxton family values"|"tamar and vince trailer"|"tamar braxton interview"|"tamar and vince premiere"

Name: tags, Length: 6055, dtype: int64

-----分割线-----

views的总描述:

count 4.094900e+04
mean 2.360785e+06
std 7.394114e+06
min 5.490000e+02
25% 2.423290e+05
50% 6.818610e+05
75% 1.823157e+06
max 2.252119e+08

Name: views, dtype: float64

views的每个值的频次:

235077 3
427242 3
8493 3
168135 3
241387 3
..
82493 1
2050620 1
487995 1
500734 1
268291 1

Name: views, Length: 40478, dtype: int64

-----分割线-----

likes的总描述:

count 4.094900e+04
mean 7.426670e+04
std 2.288853e+05
min 0.000000e+00
25% 5.424000e+03
50% 1.809100e+04
75% 5.541700e+04
max 5.613827e+06

Name: likes, dtype: float64

likes的每个值的频次:

0 172
2 34
39 22
6 21
8 20
..
32868 1
104551 1
8304 1
67014 1
26813 1

Name: likes, Length: 29850, dtype: int64

-----分割线-----

dislikes的总描述:

count 4.094900e+04
mean 3.711401e+03
std 2.902971e+04
min 0.000000e+00
25% 2.020000e+02
50% 6.310000e+02
75% 1.938000e+03
max 1.674420e+06

Name: dislikes, dtype: float64

dislikes的每个值的频次:

0 383
1 159
4 120
5 101
2 97
..
3278 1
25648 1
9451 1
189472 1
2047 1

Name: dislikes, Length: 8516, dtype: int64

-----分割线-----

comment_count的总描述:

count 4.094900e+04
mean 8.446804e+03
std 3.743049e+04
min 0.000000e+00

1

```

25%      6.140000e+02
50%      1.856000e+03
75%      5.755000e+03
max       1.361580e+06
Name: comment_count, dtype: float64
comment_count的每个值的频次:
0         760
1         74
4         71
3         61
8         52
...
10120      1
12169      1
10525      1
8079       1
26597      1
Name: comment_count, Length: 13773, dtype: int64
-----分割线-----
thumbnail_link的总描述:
count                                40949
unique                               6352
top      https://i.ytimg.com/vi/j4KvrAUjn6c/default.jpg
freq                                         30
Name: thumbnail_link, dtype: object
thumbnail_link的每个值的频次:
https://i.ytimg.com/vi/j4KvrAUjn6c/default.jpg    30
https://i.ytimg.com/vi/t4pRQ0jn23Q/default.jpg    29
https://i.ytimg.com/vi/iILJvqrAQ_w/default.jpg    29
https://i.ytimg.com/vi/r-3iathMo7o/default.jpg    29
https://i.ytimg.com/vi/NBSAQenU2Bk/default.jpg    29
..
https://i.ytimg.com/vi/RK_B4Ez4_5Q/default.jpg    1
https://i.ytimg.com/vi/rovAyg5A48Q/default.jpg    1
https://i.ytimg.com/vi/eDelIZDzmqwQ/default.jpg    1
https://i.ytimg.com/vi/yc0kcGgg3o0/default.jpg    1
https://i.ytimg.com/vi/c_KdA06MqiM/default.jpg    1
Name: thumbnail_link, Length: 6352, dtype: int64
-----分割线-----
comments_disabled的总描述:
count    40949
unique      2
top      False
freq     40316
Name: comments_disabled, dtype: object
comments_disabled的每个值的频次:
False    40316
True      633
Name: comments_disabled, dtype: int64
-----分割线-----
ratings_disabled的总描述:
count    40949
unique      2
top      False
freq     40780
Name: ratings_disabled, dtype: object
ratings_disabled的每个值的频次:
False    40780
True      169
Name: ratings_disabled, dtype: int64
-----分割线-----
video_error_or_removed的总描述:
count    40949
unique      2
top      False
freq     40926
Name: video_error_or_removed, dtype: object
video_error_or_removed的每个值的频次:
False    40926
True       23
Name: video_error_or_removed, dtype: int64
-----分割线-----
description的总描述:
count                                40379
unique                               6901
top      ▶ Listen LIVE: http://power1051fm.com/\n▶ Face...
freq                                         58
Name: description, dtype: object
description的每个值的频次:

```

► Listen LIVE: <http://power1051fm.com/>► Facebook: <https://www.facebook.com/Power1051NY/>► Twitter: <https://twitter.com/power1051/>►
Instagram: <https://www.instagram.com/power1051/>

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My Twitter: <https://twitter.com/prozdkp> My Let's Play channel, Press Buttons n
Talk: <https://www.youtube.com/channel/UCSHsNH4FZXFeSQMJ56AdrBA> My Merch/T-Shirt Store: <http://www.theyetee.com/prozd> My Tumblr:
<http://prozvoices.tumblr.com/> My Twitch: <https://www.twitch.tv/prozd> My Instagram: <https://instagram.com/prozd> My Patreon:
<http://www.patreon.com/prozd> Use the link below and the coupon code PROZDSNACKS to get \$3 off your first Japan Crate Premium or
Original: http://japancrate.com/?tap_a=13976-19476b&tap_s=76467-12d24b Use the link below and the coupon code PROZDRAMEN to get \$3 off
your first Umami Crate: http://japancrate.com/umai?tap_a=18655-b8af8b&tap_s=76467-12d24b Use the link below to get a free 14-day trial of
Funimation anime streaming: <https://www.funimation.com/prozd> Use the link below and coupon code PROZD10 to get \$10 off any Classic Bokksu
subscription: http://www.bokksu.com?rfsn=498614.9d328&utm_source=refersion&utm_medium=influencers&utm_campaign=498614.9d328 Use the link
below and the coupon code ProZDCrate to get 10% off any Loot Crate: <https://lootcrate.com/ProZD>

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Fortnite, PUBG, Far Cry 5? Which game would you play on this gaming PC setup? Visit SteelSeries.com and use discount code "Unbox15" (letters
in discount code ARE case sensitive) to get an Unbox 24hr exclusive of 15% off Arctis Pro + GameDAC: <http://steelseries.com/arctispro>
The Chair - <https://amzn.to/2Km7gC6> The Monitor - <https://amzn.to/2jWuQdk> The Gaming PC - <https://www.xidax.com/> (More info on gaming PC specs
etc. in this video - <https://youtu.be/Pvkr7s7qc0>) Is this the ultimate gaming PC setup? WATCH SOME
MORE VIDEOS... Get The OnePlus 6 EARLY! <https://youtu.be/yCxmH3psxg> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 Should You Buy The Samsung Galaxy
S9? <https://youtu.be/SIR67et5tcs> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The True All-Screen Smartphone is
Here... <https://youtu.be/sYvH7Y16iUM> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The TRUTH About Smartphones in 2018 <https://youtu.be/1kl1b0rLf00>
list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 World's Biggest Fortnite Gaming Setup! <https://youtu.be/8x7UtZKwfHA> list=PL7u4lWXQ3wFI_7PgX0C-
VTiWLeu0S4v34 The Weirdest Phones In The World... <https://youtu.be/o6T9mUq9Vgo> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The Coolest Smartphone
You'll Never Touch... <https://youtu.be/5M3mKgLTn3Q> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 I'm Switching To The Samsung Galaxy
S9 <https://youtu.be/8g-Vjq0NpLA> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The Most Expensive iPhone I've Ever
Seen... <https://youtu.be/JU3psxB3QA> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The Limited Smartphone You Never Knew
Existed... <https://youtu.be/SMLgNZYW3XE> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The Almost All-Screen
Smartphone... <https://youtu.be/jAq9RV3k90c> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 TOP SECRET SMARTPHONE
DELIVERY! https://youtu.be/BNnFgT_CAE list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The iPhone X Home Button... Is This Real Life?
https://youtu.be/Vz_EE5Ta9ZA list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 Fortnite on an INSANE \$20,000 Gaming PC <https://youtu.be/Pvkr7s7qc0>
list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The \$200 Smartphone You NEED To Know About... <https://youtu.be/uxL0fjaWRvw> list=PL7u4lWXQ3wFI_7PgX0C-
VTiWLeu0S4v34 This New Smartphone Is NOT What It Looks Like... <https://youtu.be/r8vFZ0HAaz0> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 Is The
Samsung Galaxy S9 Worth The Hype? <https://youtu.be/g30Rhk82rmg> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 Unique Gadgets You Wouldn't Expect
To Exist <https://youtu.be/z5dyE6qQZU> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The Worst Gadget EVER On Unbox
Therapy... <https://youtu.be/Z0FoPTAQZlQ> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The Worst Text You Could Ever
Receive... <https://youtu.be/HUE9mCN7sek> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The Essential Phone Is Back! <https://youtu.be/Zx0mJfCEgoc>
list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 What If You Could Get AirPods For Only \$40? https://youtu.be/6N5V_7_n1uI list=PL7u4lWXQ3wFI_7PgX0C-
VTiWLeu0S4v34 I Bought The Cheapest Smartphone on Amazon... <https://youtu.be/YkGAg9WmYBs> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 Unique
Gadgets You Can Buy Right Now <https://youtu.be/Yzsf9SECCeo> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 DON'T Buy The Google Pixel
Buds <https://youtu.be/lGkrhR2mfl8> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 How To Turn Any Android Phone Into An
iPhone... <https://youtu.be/14pYNYwLqDs> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 Is The LG V30 The Most Underrated Smartphone?
<https://youtu.be/YsWIHhKmmvY> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The Best Wireless Headphones You Can Buy Right
Now <https://youtu.be/SXY0bZahu-o> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 Unboxing The Samsung Galaxy S9 Clone <https://youtu.be/1xgbmrsgqr47>
list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 It Has Double The Battery of iPhone X <https://youtu.be/8Np9Kk82-zA> list=PL7u4lWXQ3wFI_7PgX0C-
VTiWLeu0S4v34 The Mind Blowing 33 Million Pixel Display... <https://youtu.be/0KAU1Xx59ho> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 Cool Gadgets
Under \$10 <https://youtu.be/hNrSNrEvkQ> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 Which Smartphone Do They ACTUALLY Use? --- MKBHD, Austin
Evans, Linus + More <https://youtu.be/Hi2tjMLVpdQ> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 Unboxing The World's Smallest
Phone <https://youtu.be/SSzyGCjH88o> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 The Most RIDICULOUS MacBook Pro <https://youtu.be/46qTg3swoEo>
list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 A Message from Apple... <https://youtu.be/UiaqBdzCcBA> list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 Unique
iPhone Accessories https://youtu.be/uZgnXJz_9DM list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 DON'T Buy The iPhone X <https://youtu.be/2fGXDFiFBhg>
list=PL7u4lWXQ3wFI_7PgX0C-VTiWLeu0S4v34 FOLLOW ME IN THESE PLACES FOR UPDATES Twitter - <http://twitter.com/unboxtherapy> Facebook -
<http://facebook.com/lewis.hilseinteger> Instagram - <http://instagram.com/unboxtherapy> Google Plus - <http://bit.ly/1auEeak> 29

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Khloe and Corey hash out there issues during an intense lunch. Plus, she and Tristan Thompson break the news that they're expecting.\n\nSUBSCRIBE: <http://bit.ly/Eentsub>\n\nAbout Keeping Up With the Kardashians:\nThings change, but this famous family stays the same. Can you keep up with the drama?\n\nConnect with the Kardashians:\nVisit the KUWTK WEBSITE: <http://bit.ly/KUWTKweb>\nLike KUWTK on FACEBOOK: <http://bit.ly/KUWTKfb> \nFollow KUWTK on TWITTER: <http://bit.ly/KUWTKtwtr> \n\nAbout E! Entertainment:\nE! is on the Pulse of Pop Culture, bringing fans the very best original content including reality series, scripted programming, exclusive specials, breaking entertainment news, streaming events and more. Passionate viewers can't get enough of our Pop Culture hits including Keeping Up with the Kardashians," "Fashion Police," "The Royals," Total Divas" and "Botched." And with new original programming on the way, fans have even more to love.\n\nConnect with E! Entertainment:\nVisit the E! WEBSITE: <http://eonli.ne/1iX6d8n>\nLike E! on FACEBOOK: <http://on.fb.me/1fzeamg>\nCheck out E! on INSTAGRAM: <http://bit.ly/EInsta>\nFollow E! on TWITTER: <http://bit.ly/EEntTwitter>\n\nKeeping Up With the Kardashians Katch-Up: S14, EP.14 | E!\n<http://www.youtube.com/user/Eentertainment>

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Singer Patti LaBelle tells Andy Cohen what advice she would and has given to goddaughter Mariah Carey and says what she thinks about some negative people in Mariah's life.\n► Subscribe To WWHL: <http://bravo.ly/WWHLSub>\n\nWatch WWHL Sun-Thu 11/10c:\n\nWWHL Website: <http://www.bravotv.com/watch-what-happens-live>\n\nFollow WWHL: <https://twitter.com/BravoWWHL>\n\nLike WWHL: <https://www.facebook.com/WatchWhatHappensLive>\n\nWWHL Tumblr: <http://bravowhl.tumblr.com/>\n\n'Watch What Happens: Live' is Bravo's late-night, interactive talk show that features guests from the world of entertainment, politics, and pop culture. Hosted by Andy Cohen, the series includes lively debates on everything from fashion, the latest on everyone's favorite Bravolebrities, and what celebrity is making headlines that week. Past guests who have joined Cohen in the Bravo Clubhouse include Sarah Jessica Parker, Tina Fey, Khloe Kardashian, Jennifer Lopez, Liam Neeson, Kelly Ripa, Jimmy Fallon, Anderson Cooper, Jennifer Lawrence, and Lance Bass.\n\n\nWatch More Bravo:\n\nBravo Website: <http://www.bravotv.com/>\n\nBravo Youtube: <http://www.youtube.com/videoobybravo>\n\nFollow Bravo: <http://www.twitter.com/bravotv>\n\nLike Bravo: <https://www.facebook.com/BRAVO>\n\nPin Bravo: <http://www.pinterest.com/bravobybravo>\n\nBravo Instagram: <http://www.instagram.com/bravotv>\n\nBravo Tumblr: <http://bravotv.tumblr.com/>\n\n\nAfter Show: Patti LaBelle's Advice For Mariah Carey | WWHL

Name: description, Length: 6901, dtype: int64
-----分割线-----

likes_log的总描述:

| | |
|-------|--------------|
| count | 40949.000000 |
| mean | 9.599392 |
| std | 2.115725 |
| min | 0.000000 |
| 25% | 8.598773 |
| 50% | 9.803225 |
| 75% | 10.922660 |
| max | 15.540743 |

Name: likes_log, dtype: float64

likes_log的每个值的频次:

| | |
|----------|-----|
| 0.000000 | 172 |
| 1.098612 | 34 |
| 3.688879 | 22 |
| 1.945910 | 21 |
| 2.197225 | 20 |

...

| | |
|-----------|---|
| 11.157621 | 1 |
| 10.869159 | 1 |
| 9.624699 | 1 |
| 12.643895 | 1 |
| 11.721410 | 1 |

Name: likes_log, Length: 29850, dtype: int64
-----分割线-----

views_log的总描述:

| | |
|-------|--------------|
| count | 40949.000000 |
| mean | 13.337995 |
| std | 1.709989 |
| min | 6.309918 |
| 25% | 12.398056 |
| 50% | 13.432583 |
| 75% | 14.416081 |
| max | 19.232552 |

Name: views_log, dtype: float64

views_log的每个值的频次:

| | |
|-----------|---|
| 12.394161 | 3 |
| 10.909034 | 3 |
| 12.367673 | 3 |
| 10.121056 | 3 |
| 9.047115 | 3 |

..

| | |
|-----------|---|
| 13.694479 | 1 |
| 10.859749 | 1 |
| 15.130452 | 1 |
| 16.684928 | 1 |
| 13.421313 | 1 |

Name: views_log, Length: 40478, dtype: int64
-----分割线-----

dislikes_log的总描述:

| | |
|-------|--------------|
| count | 40949.000000 |
| mean | 6.387610 |
| std | 1.915583 |
| min | 0.000000 |
| 25% | 5.313206 |
| 50% | 6.448889 |

```

75%          7.569928
max          14.330978
Name: dislikes_log, dtype: float64
dislikes_log的每个值的频次:
0.000000      383
0.693147      159
1.609438      120
1.791759      101
1.098612       97

...
9.731156       1
9.946882       1
9.595535       1
8.099554       1
10.614892       1
Name: dislikes_log, Length: 8516, dtype: int64
-----分割线-----
comment_log的总描述:
count      40949.000000
mean        7.387712
std         2.057100
min         0.000000
25%         6.421622
50%         7.526718
75%         8.657998
max         14.124157
Name: comment_log, dtype: float64
comment_log的每个值的频次:
0.000000      760
0.693147       74
1.609438       71
1.386294       61
2.197225       52

...
9.212638       1
9.783577       1
9.863082       1
10.135948       1
9.498222       1
Name: comment_log, Length: 13773, dtype: int64

```

3.4 五数概括和缺失值个数

```

# 纯数值的属性
number_list = ["category_id", "views", "likes", "dislikes", "comment_count"]

```

```

# 输出指定数据、指定属性的5数概括及缺失值的个数
# column_name: 属性名
# data: 数据来源
def FiveNumberandNull(data, column_name):
    print("%s的情况如下: "%(column_name))
    # 缺失值的情况
    data_column = data[column_name]
    null_number = data_column.isnull().sum()
    print("null的个数:%d"%(null_number))
    # 五数概括 Minimum (最小值)、Q1 (25%)、Median (中位数、)、Q3 (75%)、Maximum (最大值)
    data_column = data_column.dropna(axis = 0) #删除NaN值
    Minimum = min(data_column)
    Maximum = max(data_column)
    Q1 = np.percentile(data_column, 25)
    Median = np.median(data_column)
    Q3 = np.percentile(data_column, 75)
    print("五数概括: Minimum:%d; Q1:%d; Median:%d; Q3:%d; Maximum:%d;\n"%(Minimum , Q1 , Median , Q3 , Maximum))

```

由数据分析可以发现，数据集中这些主要的数字数据不包含NULL

```

for column_name in number_list:
    FiveNumberandNull(df_youtube_us, column_name)

```

```

category_id的情况如下:
null的个数:0
五数概括: Minimum:1; Q1:17; Median:24; Q3:25; Maximum:43;

views的情况如下:
null的个数:0
五数概括: Minimum:549; Q1:242329; Median:681861; Q3:1823157; Maximum:225211923;

likes的情况如下:
null的个数:0
五数概括: Minimum:0; Q1:5424; Median:18091; Q3:55417; Maximum:5613827;

dislikes的情况如下:
null的个数:0
五数概括: Minimum:0; Q1:202; Median:631; Q3:1938; Maximum:1674420;

comment_count的情况如下:

```

```
null的个数:0  
五数概括: Minimum:0; Q1:614; Median:1856; Q3:5755; Maximum:1361580;
```

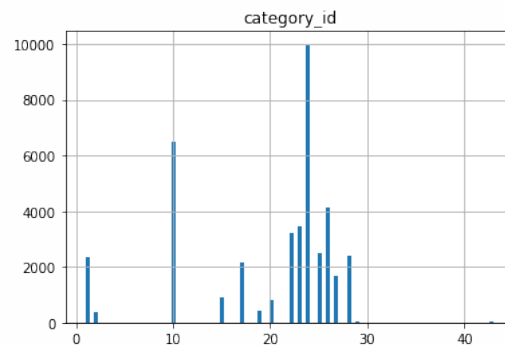
3.5 绘图

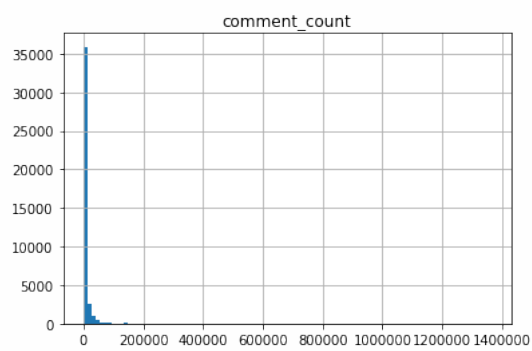
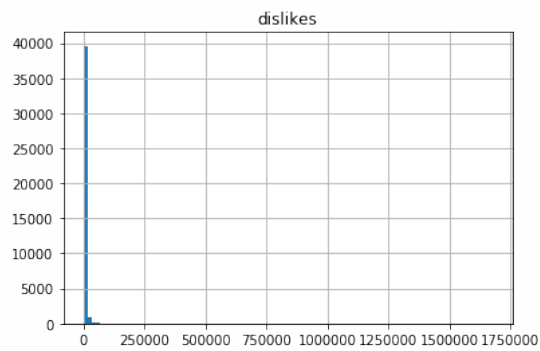
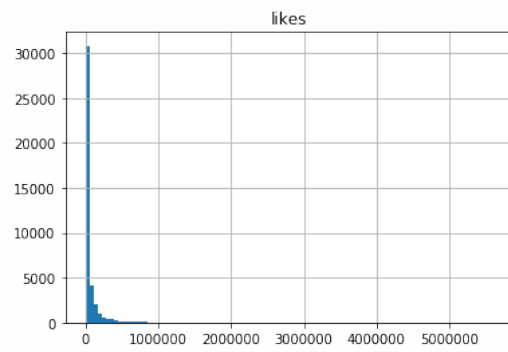
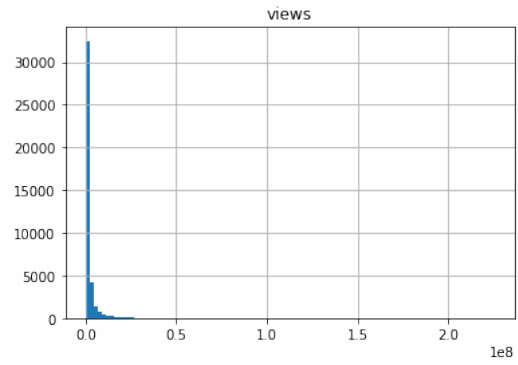
以直方图、盒图、分布图为例

```
#绘制直方图:100bins  
def histogram(column_name,data):  
    histogram = data[column_name].hist(bins= 100)  
    plt.title(column_name)  
    plt.show()  
  
#绘制盒图  
def box(column_name,data):  
    data[column_name].plot.box()  
    plt.title(column_name)  
    plt.show()  
    df_yout['likes_log'] = np.log(df_yout['likes'] + 1)  
# 绘制正态分布图  
def logDistribution(data):  
    data['likes_log'] = np.log(data['likes'] + 1)  
    data['views_log'] = np.log(data['views'] + 1)  
    data['dislikes_log'] = np.log(data['dislikes'] + 1)  
    data['comment_log'] = np.log(data['comment_count'] + 1)  
  
    plt.figure(figsize = (12,6))  
  
    plt.subplot(221)  
    g1 = sns.distplot(data['views_log'])  
    g1.set_title("VIEWS LOG DISTRIBUTION", fontsize=16)  
  
    plt.subplot(224)  
    g2 = sns.distplot(data['likes_log'],color='green')  
    g2.set_title('LIKES LOG DISTRIBUTION', fontsize=16)  
  
    plt.subplot(223)  
    g3 = sns.distplot(data['dislikes_log'], color='r')  
    g3.set_title("DISLIKES LOG DISTRIBUTION", fontsize=16)  
  
    plt.subplot(222)  
    g4 = sns.distplot(data['comment_log'])  
    g4.set_title("COMMENTS LOG DISTRIBUTION", fontsize=16)  
  
    plt.subplots_adjust(wspace = 0.2, hspace = 0.4,top = 0.9)  
  
    plt.show()
```

3.5.1 直方图

```
for column_name in number_list:  
    histogram(column_name,df_youtube_us)
```

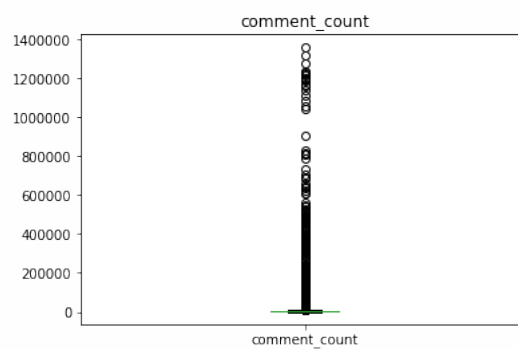
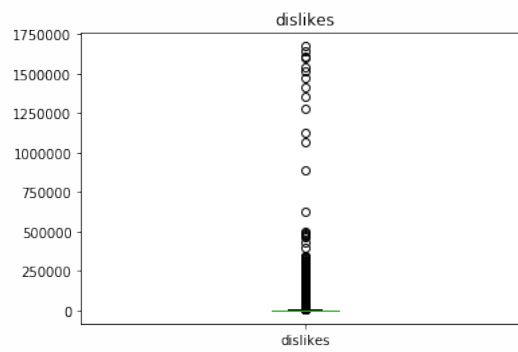
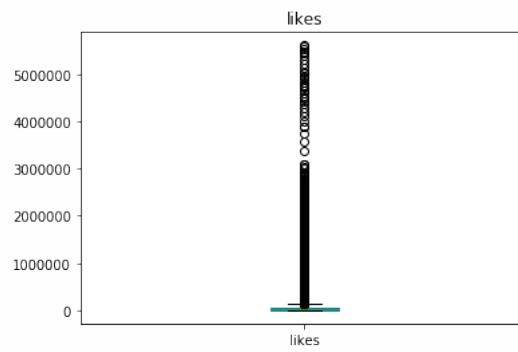
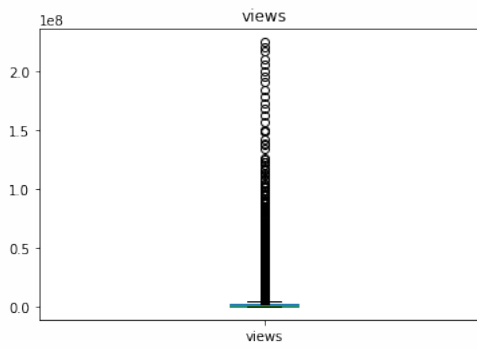
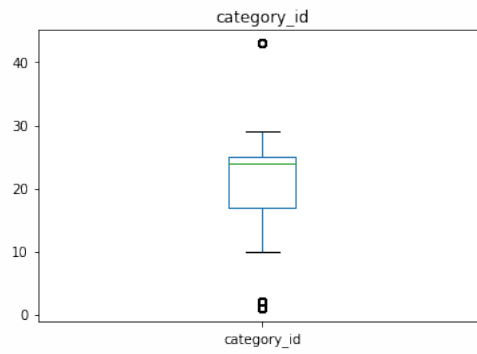




3.5.2 盒图

绝大多数的类别id处在10到30之间
观看次数的数量随着数值增大而减小，绝大多数位于 1.5×10^8 以下

```
for column_name in number_list:
    box(column_name, df_youtube_us)
```



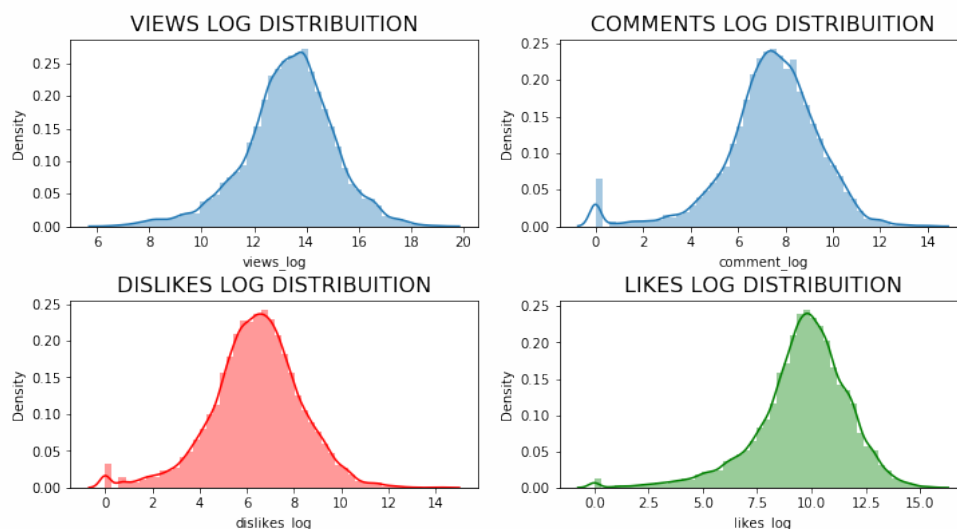
```
df_youtube_us.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 40949 entries, 0 to 40948
Data columns (total 17 columns):
video_id          40949 non-null object
trending_date     40949 non-null object
title             40949 non-null object
channel_title     40949 non-null object
category_id       40949 non-null int64
publish_time      40949 non-null object
tags              40949 non-null object
views             40949 non-null int64
likes             40949 non-null int64
dislikes          40949 non-null int64
comment_count     40949 non-null int64
thumbnail_link    40949 non-null object
comments_disabled 40949 non-null bool
ratings_disabled  40949 non-null bool
video_error_or_removed 40949 non-null bool
description       40379 non-null object
likes_log         40949 non-null float64
dtypes: bool(3), float64(1), int64(5), object(8)
memory usage: 4.5+ MB
```

3.5.3 分布图

```
logDistribution(df_youtube_us)
```

```
/Users/guopeiqi/opt/anaconda3/envs/deeplearning/lib/python3.7/site-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a
deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with
similar flexibility) or `histplot` (an axes-level function for histograms).
  warnings.warn(msg, FutureWarning)
/Users/guopeiqi/opt/anaconda3/envs/deeplearning/lib/python3.7/site-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a
deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with
similar flexibility) or `histplot` (an axes-level function for histograms).
  warnings.warn(msg, FutureWarning)
/Users/guopeiqi/opt/anaconda3/envs/deeplearning/lib/python3.7/site-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a
deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with
similar flexibility) or `histplot` (an axes-level function for histograms).
  warnings.warn(msg, FutureWarning)
/Users/guopeiqi/opt/anaconda3/envs/deeplearning/lib/python3.7/site-packages/seaborn/distributions.py:2619: FutureWarning: `distplot` is a
deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with
similar flexibility) or `histplot` (an axes-level function for histograms).
  warnings.warn(msg, FutureWarning)
```



3.6 缺失值处理

由于数据中的主要数值型数据不包含null值，所以不需要进行缺失值处理，若存在，可以使用以下方法进行处理，并进行可视化对比

```
# 剔除null，并可视化对比
def null_drop(data):
    data_nonull = data.dropna(axis = 0)
```



```
# 绘制直方图
hist = Data1.hist(bins=100)
# 绘制盒图
data_nonull.plot.box()
plt.show()

# 用最高频率值来填补缺失值
def null_mode(data):
    data_nonull = data.fillna(data.mode()) #使用众数
    # 绘制直方图
    hist = data_nonull.hist(bins=100)
    # 绘制盒图
    data_nonull.plot.box()
    plt.show()
```