wrangle_act

January 30, 2019

1 Import Libraries

```
In [2]: import pandas as pd
    import numpy as np
    from numpy import nan
    import tweepy
    import requests
    import json
    import os
    import re
    import matplotlib.pyplot as plt
    import sys
```

2 Gather

```
In [3]: archive = pd.read_csv("./twitter-archive-enhanced.csv")
In [4]: ImageURL = "https://d17h27t6h5i5a5.cloudfront.net/topher/2017/August/599fd2ad_image-pred
    response = requests.get(ImageURL)
    with open(os.path.join(os.getcwd(), ImageURL.split('/')[-1]), mode = 'wb') as file:
        file.write(response.content)
    imagePrediction = pd.read_csv('./image-predictions.tsv',sep='\t')
In [5]: # Personal API keys, secrets, and tokens have been replaced with placeholders
        consumer_key = 'xvWlbHKWXDHUYwFJiW4EpKQoe'
        consumer_secret = 'M7xWLk2p2lemGtlsksz1NFau9MfRZXbQJkEVratJ5NMUlxeIrD'
        access_token = '182197942-XPars3NGL01BI9BbMtJqoa65piK2atTmTa62LB87'
        access_secret = 'MiXDOwIf5yOLNP1deDX72ew9JoqL69P1Z92HV5gmoEtFk'

        auth = tweepy.OAuthHandler(consumer_key, consumer_secret)
        auth.set_access_token(access_token, access_secret)
```

```
api = tweepy.API(auth_handler=auth, wait_on_rate_limit=True, wait_on_rate_limit_notify=True)
In [6]: id_errors = []
        def get_all_tweets(screen_name):
            new_tweets = api.user_timeline(screen_name = screen_name,count=200)
            alltweets = []
            alltweets.extend(new_tweets)
            oldest = alltweets[-1].id - 1
            while len(new_tweets) > 0:
                try:
                    new_tweets = api.user_timeline(screen_name = screen_name,count=200,max_id=ol
                    alltweets.extend(new_tweets)
                    oldest = alltweets[-1].id - 1
                    print("%s completed" % (len(alltweets)))
                except Exception as e:
                    print(new_tweets.id_str + ": " + str(e))
                    id_errors.append(new_tweets)
                    continue
            outtweets = [[tweet.id_str, tweet.retweet_count,tweet.favorite_count] for tweet in
            df = pd.DataFrame.from_dict(outtweets)
            df.to_csv('./tweet_json.txt', header =True,index=None, sep=' ', mode='w')
            print('True')
        if __name__ == '__main__':
            get_all_tweets("dog_rates")
399 completed
599 completed
799 completed
999 completed
1199 completed
1399 completed
1599 completed
1799 completed
1999 completed
2157 completed
2157 completed
True
```

3 Access

In [8]: archive

Out [8]	1.	tweet_id	in_reply_to_status_id	in_reply_to_user_id	\
ouv [o	0	892420643555336193	NaN	NaN	`
	1	892177421306343426	NaN	NaN	
	2	891815181378084864	NaN	NaN	
	3	891689557279858688	NaN	NaN	
	4	891327558926688256	NaN	NaN	
	5	891087950875897856	NaN	NaN	
	6	890971913173991426	NaN	NaN	
	7	890729181411237888	NaN	NaN	
	8	890609185150312448	NaN	NaN	
	9	890240255349198849	NaN	NaN	
	10	890006608113172480	NaN	NaN	
	11	889880896479866881	NaN	NaN	
	12	889665388333682689	NaN	NaN	
	13	889638837579907072	NaN	NaN	
	14	889531135344209921	NaN	NaN	
	15	889278841981685760	NaN	NaN	
	16	888917238123831296	NaN	NaN	
	17	888804989199671297	NaN	NaN	
	18	888554962724278272	NaN	NaN	
	19	888202515573088257	NaN	NaN	
	20	888078434458587136	NaN	NaN	
	21	887705289381826560	NaN	NaN	
	22	887517139158093824	NaN	NaN	
	23	887473957103951883	NaN	NaN	
	24	887343217045368832	NaN	NaN	
	25	887101392804085760	NaN	NaN	
	26	886983233522544640	NaN	NaN	
	27	886736880519319552	NaN	NaN	
	28	886680336477933568	NaN	NaN	
	29	886366144734445568	NaN	NaN	
	2326	666411507551481857	NaN	NaN	
	2327	666407126856765440	NaN	NaN	
	2328	666396247373291520	NaN	NaN	
	2329	666373753744588802	NaN	NaN	
	2330	666362758909284353	NaN	NaN	
	2331	666353288456101888	NaN	NaN	
	2332	666345417576210432	NaN	NaN	
	2333	666337882303524864	NaN	NaN	

2334	666293911632134144	NaN	NaN
2335	666287406224695296	NaN	NaN
2336	666273097616637952	NaN	NaN
2337	666268910803644416	NaN	NaN
2338	666104133288665088	NaN	NaN
2339	666102155909144576	NaN	NaN
2340	666099513787052032	NaN	NaN
2341	666094000022159362	NaN	NaN
2342	666082916733198337	NaN	NaN
2343	666073100786774016	NaN	NaN
2344	666071193221509120	NaN	NaN
2345	666063827256086533	NaN	NaN
2346	666058600524156928	NaN	NaN
2347	666057090499244032	NaN	NaN
2348	666055525042405380	NaN	NaN
2349	666051853826850816	NaN	NaN
2350	666050758794694657	NaN	NaN
2351	666049248165822465	NaN	NaN
2352	666044226329800704	NaN	NaN
2353	666033412701032449	NaN	NaN
2354	666029285002620928	NaN	NaN
2355	666020888022790149	NaN	NaN

timestamp '

```
0
      2017-08-01 16:23:56 +0000
      2017-08-01 00:17:27 +0000
1
2
      2017-07-31 00:18:03 +0000
3
      2017-07-30 15:58:51 +0000
4
      2017-07-29 16:00:24 +0000
5
      2017-07-29 00:08:17 +0000
6
      2017-07-28 16:27:12 +0000
      2017-07-28 00:22:40 +0000
7
8
      2017-07-27 16:25:51 +0000
9
      2017-07-26 15:59:51 +0000
10
      2017-07-26 00:31:25 +0000
      2017-07-25 16:11:53 +0000
11
      2017-07-25 01:55:32 +0000
12
13
      2017-07-25 00:10:02 +0000
      2017-07-24 17:02:04 +0000
14
15
      2017-07-24 00:19:32 +0000
16
      2017-07-23 00:22:39 +0000
17
      2017-07-22 16:56:37 +0000
18
      2017-07-22 00:23:06 +0000
      2017-07-21 01:02:36 +0000
19
20
      2017-07-20 16:49:33 +0000
21
      2017-07-19 16:06:48 +0000
22
      2017-07-19 03:39:09 +0000
23
      2017-07-19 00:47:34 +0000
```

```
24
      2017-07-18 16:08:03 +0000
25
      2017-07-18 00:07:08 +0000
26
      2017-07-17 16:17:36 +0000
27
      2017-07-16 23:58:41 +0000
      2017-07-16 20:14:00 +0000
28
      2017-07-15 23:25:31 +0000
29
. . .
     2015-11-17 00:24:19 +0000
2326
2327
     2015-11-17 00:06:54 +0000
      2015-11-16 23:23:41 +0000
2328
2329
      2015-11-16 21:54:18 +0000
2330
      2015-11-16 21:10:36 +0000
2331
     2015-11-16 20:32:58 +0000
2332
     2015-11-16 20:01:42 +0000
2333
      2015-11-16 19:31:45 +0000
2334
     2015-11-16 16:37:02 +0000
2335
      2015-11-16 16:11:11 +0000
2336
     2015-11-16 15:14:19 +0000
2337
      2015-11-16 14:57:41 +0000
2338
     2015-11-16 04:02:55 +0000
      2015-11-16 03:55:04 +0000
2339
2340
      2015-11-16 03:44:34 +0000
2341
     2015-11-16 03:22:39 +0000
2342
    2015-11-16 02:38:37 +0000
2343
     2015-11-16 01:59:36 +0000
2344
     2015-11-16 01:52:02 +0000
     2015-11-16 01:22:45 +0000
2345
2346
     2015-11-16 01:01:59 +0000
      2015-11-16 00:55:59 +0000
2347
2348
     2015-11-16 00:49:46 +0000
2349
      2015-11-16 00:35:11 +0000
2350
      2015-11-16 00:30:50 +0000
      2015-11-16 00:24:50 +0000
2351
2352
     2015-11-16 00:04:52 +0000
2353
     2015-11-15 23:21:54 +0000
      2015-11-15 23:05:30 +0000
2354
     2015-11-15 22:32:08 +0000
2355
                                                    source \
0
      <a href="http://twitter.com/download/iphone" r...</pre>
1
      <a href="http://twitter.com/download/iphone" r...</pre>
2
      <a href="http://twitter.com/download/iphone" r...</pre>
3
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
4
5
      <a href="http://twitter.com/download/iphone" r...</pre>
6
      <a href="http://twitter.com/download/iphone" r...</pre>
7
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
```

```
9
      <a href="http://twitter.com/download/iphone" r...</pre>
10
      <a href="http://twitter.com/download/iphone" r...</pre>
11
      <a href="http://twitter.com/download/iphone" r...</pre>
12
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
13
      <a href="http://twitter.com/download/iphone" r...</pre>
14
      <a href="http://twitter.com/download/iphone" r...</pre>
15
16
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
17
18
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
19
20
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...
21
      <a href="http://twitter.com/download/iphone" r...</pre>
22
23
      <a href="http://twitter.com/download/iphone" r...</pre>
24
      <a href="http://twitter.com/download/iphone" r...</pre>
25
      <a href="http://twitter.com/download/iphone" r...</pre>
26
      <a href="http://twitter.com/download/iphone" r...</pre>
27
      <a href="http://twitter.com/download/iphone" r...</pre>
28
      <a href="http://twitter.com/download/iphone" r...</pre>
29
      <a href="http://twitter.com/download/iphone" r...</pre>
. . .
2326
      <a href="http://twitter.com/download/iphone" r...</pre>
2327
      <a href="http://twitter.com/download/iphone" r...</pre>
2328
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
2329
2330
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
2331
2332
      <a href="http://twitter.com/download/iphone" r...</pre>
2333
      <a href="http://twitter.com/download/iphone" r...</pre>
2334
      <a href="http://twitter.com/download/iphone" r...</pre>
2335
      <a href="http://twitter.com/download/iphone" r...</pre>
2336
      <a href="http://twitter.com/download/iphone" r...</pre>
2337
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
2338
2339
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...
2340
2341
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
2342
2343
      <a href="http://twitter.com/download/iphone" r...</pre>
2344
      <a href="http://twitter.com/download/iphone" r...</pre>
2345
      <a href="http://twitter.com/download/iphone" r...</pre>
2346
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
2347
2348
      <a href="http://twitter.com/download/iphone" r...</pre>
2349
      <a href="http://twitter.com/download/iphone" r...</pre>
2350
      <a href="http://twitter.com/download/iphone" r...</pre>
2351
      <a href="http://twitter.com/download/iphone" r...</pre>
```

```
2352 <a href="http://twitter.com/download/iphone" r...
      <a href="http://twitter.com/download/iphone" r...</pre>
2353
      <a href="http://twitter.com/download/iphone" r...</pre>
2354
2355
      <a href="http://twitter.com/download/iphone" r...</pre>
                                                    text retweeted_status_id
0
      This is Phineas. He's a mystical boy. Only eve...
1
      This is Tilly. She's just checking pup on you...
                                                                          NaN
      This is Archie. He is a rare Norwegian Pouncin...
                                                                           NaN
      This is Darla. She commenced a snooze mid meal...
3
                                                                           NaN
4
      This is Franklin. He would like you to stop ca...
                                                                           NaN
      Here we have a majestic great white breaching ...
5
                                                                           NaN
      Meet Jax. He enjoys ice cream so much he gets ...
6
                                                                           NaN
7
      When you watch your owner call another dog a g...
                                                                           NaN
      This is Zoey. She doesn't want to be one of th...
8
                                                                           NaN
9
      This is Cassie. She is a college pup. Studying...
                                                                           NaN
10
      This is Koda. He is a South Australian decksha...
                                                                           NaN
      This is Bruno. He is a service shark. Only get...
                                                                           NaN
11
      Here's a puppo that seems to be on the fence a...
12
                                                                           NaN
13
      This is Ted. He does his best. Sometimes that'...
                                                                           NaN
      This is Stuart. He's sporting his favorite fan...
14
                                                                           NaN
      This is Oliver. You're witnessing one of his m...
15
                                                                           NaN
16
      This is Jim. He found a fren. Taught him how t...
                                                                           NaN
17
      This is Zeke. He has a new stick. Very proud o...
                                                                           NaN
18
      This is Ralphus. He's powering up. Attempting ...
                                                                           NaN
      RT @dog_rates: This is Canela. She attempted s...
                                                                  8.874740e+17
19
      This is Gerald. He was just told he didn't get...
20
                                                                           NaN
      This is Jeffrey. He has a monopoly on the pool...
21
                                                                           NaN
22
      I've yet to rate a Venezuelan Hover Wiener. Th...
                                                                           NaN
23
      This is Canela. She attempted some fancy porch...
                                                                           NaN
24
      You may not have known you needed to see this ...
                                                                           NaN
      This... is a Jubilant Antarctic House Bear. We...
25
                                                                           NaN
26
      This is Maya. She's very shy. Rarely leaves he...
                                                                           NaN
27
      This is Mingus. He's a wonderful father to his...
                                                                           NaN
      This is Derek. He's late for a dog meeting. 13...
28
                                                                           {\tt NaN}
29
      This is Roscoe. Another pupper fallen victim t...
                                                                           NaN
                                                                           . . .
     This is quite the dog. Gets really excited whe...
2326
                                                                           NaN
      This is a southern Vesuvius bumblegruff. Can d...
2327
                                                                           NaN
      Oh goodness. A super rare northeast Qdoba kang...
2328
                                                                           NaN
2329
     Those are sunglasses and a jean jacket. 11/10 ...
                                                                           NaN
     Unique dog here. Very small. Lives in containe...
2330
                                                                           NaN
2331
      Here we have a mixed Asiago from the Galápagos...
                                                                           NaN
     Look at this jokester thinking seat belt laws ...
2332
                                                                           NaN
     This is an extremely rare horned Parthenon. No...
2333
                                                                           NaN
2334
     This is a funny dog. Weird toes. Won't come do...
                                                                           NaN
2335
     This is an Albanian 3 1/2 legged Episcopalian...
                                                                           NaN
2336
         Can take selfies 11/10 https://t.co/ws2AMaNwPW
                                                                           NaN
```

```
Very concerned about fellow dog trapped in com...
2337
2338
     Not familiar with this breed. No tail (weird)...
2339
      Oh my. Here you are seeing an Adobe Setter giv...
2340
      Can stand on stump for what seems like a while...
2341
      This appears to be a Mongolian Presbyterian mi...
2342
     Here we have a well-established sunblockerspan...
2343
     Let's hope this flight isn't Malaysian (lol). ...
2344
     Here we have a northern speckled Rhododendron...
2345
     This is the happiest dog you will ever see. Ve...
2346
     Here is the Rand Paul of retrievers folks! He'...
2347
     My oh my. This is a rare blond Canadian terrie...
2348
     Here is a Siberian heavily armored polar bear ...
2349
     This is an odd dog. Hard on the outside but lo...
2350
     This is a truly beautiful English Wilson Staff...
2351
     Here we have a 1949 1st generation vulpix. Enj...
2352 This is a purebred Piers Morgan. Loves to Netf...
2353
     Here is a very happy pup. Big fan of well-main...
2354
     This is a western brown Mitsubishi terrier. Up...
2355
     Here we have a Japanese Irish Setter. Lost eye...
      retweeted_status_user_id retweeted_status_timestamp \
0
                            NaN
                                                        NaN
1
                            NaN
                                                        NaN
2
                            NaN
                                                        NaN
3
                            NaN
                                                        NaN
4
                            NaN
                                                        NaN
5
                            NaN
                                                        NaN
6
                            NaN
                                                        NaN
7
                            NaN
                                                        NaN
8
                            NaN
                                                        NaN
9
                            NaN
                                                        NaN
10
                            NaN
                                                        NaN
11
                            NaN
                                                        NaN
12
                            NaN
                                                        NaN
13
                            NaN
                                                        {\tt NaN}
14
                            NaN
                                                        NaN
15
                            NaN
                                                        NaN
16
                            NaN
                                                        NaN
17
                            NaN
                                                        NaN
18
                            NaN
                                                        NaN
19
                  4.196984e+09
                                 2017-07-19 00:47:34 +0000
20
                            NaN
                                                        NaN
21
                            NaN
                                                        NaN
                            NaN
22
                                                        NaN
23
                            NaN
                                                        NaN
24
                            NaN
                                                        NaN
25
                            NaN
                                                        NaN
26
                            NaN
                                                        NaN
```

NaN

```
27
                             NaN
                                                          NaN
28
                             NaN
                                                          NaN
                             NaN
29
                                                          NaN
. . .
2326
                             NaN
                                                          NaN
2327
                             NaN
                                                          NaN
2328
                             NaN
                                                          NaN
2329
                             NaN
                                                          NaN
2330
                             NaN
                                                          NaN
2331
                             NaN
                                                          NaN
2332
                             NaN
                                                          NaN
2333
                             NaN
                                                          NaN
2334
                             NaN
                                                          NaN
2335
                             NaN
                                                          NaN
                             NaN
2336
                                                          NaN
2337
                             NaN
                                                          NaN
2338
                             NaN
                                                          NaN
2339
                             NaN
                                                          {\tt NaN}
2340
                             NaN
                                                          NaN
2341
                             NaN
                                                          NaN
2342
                             NaN
                                                          NaN
2343
                             NaN
                                                          NaN
2344
                             NaN
                                                          NaN
2345
                             NaN
                                                          NaN
2346
                             NaN
                                                          NaN
2347
                             NaN
                                                          NaN
2348
                             NaN
                                                          NaN
2349
                             NaN
                                                          NaN
2350
                             NaN
                                                          NaN
2351
                             NaN
                                                          NaN
2352
                             NaN
                                                          NaN
2353
                             NaN
                                                          NaN
2354
                             NaN
                                                          NaN
2355
                             NaN
                                                          NaN
                                             expanded_urls rating_numerator
0
      https://twitter.com/dog_rates/status/892420643...
                                                                             13
1
      https://twitter.com/dog_rates/status/892177421...
                                                                             13
2
      https://twitter.com/dog_rates/status/891815181...
                                                                             12
3
      https://twitter.com/dog_rates/status/891689557...
                                                                             13
4
      https://twitter.com/dog_rates/status/891327558...
                                                                             12
5
      https://twitter.com/dog_rates/status/891087950...
                                                                             13
6
      https://gofundme.com/ydvmve-surgery-for-jax,ht...
                                                                             13
7
      https://twitter.com/dog_rates/status/890729181...
                                                                             13
8
      https://twitter.com/dog_rates/status/890609185...
                                                                             13
9
      https://twitter.com/dog_rates/status/890240255...
                                                                             14
10
      https://twitter.com/dog_rates/status/890006608...
                                                                             13
11
      https://twitter.com/dog_rates/status/889880896...
                                                                             13
```

```
12
      https://twitter.com/dog_rates/status/889665388...
                                                                         13
13
      https://twitter.com/dog_rates/status/889638837...
                                                                        12
      https://twitter.com/dog_rates/status/889531135...
14
                                                                        13
15
      https://twitter.com/dog_rates/status/889278841...
                                                                        13
      https://twitter.com/dog_rates/status/888917238...
                                                                        12
16
      https://twitter.com/dog_rates/status/888804989...
17
                                                                        13
      https://twitter.com/dog_rates/status/888554962...
18
                                                                        13
      https://twitter.com/dog_rates/status/887473957...
19
                                                                        13
20
      https://twitter.com/dog_rates/status/888078434...
                                                                        12
      https://twitter.com/dog_rates/status/887705289...
21
                                                                        13
22
      https://twitter.com/dog_rates/status/887517139...
                                                                        14
23
      https://twitter.com/dog_rates/status/887473957...
                                                                        13
      https://twitter.com/dog_rates/status/887343217...
24
                                                                        13
      https://twitter.com/dog_rates/status/887101392...
25
                                                                        12
      https://twitter.com/dog_rates/status/886983233...
26
                                                                        13
      https://www.gofundme.com/mingusneedsus,https:/...
27
                                                                        13
      https://twitter.com/dog_rates/status/886680336...
28
                                                                        13
      https://twitter.com/dog_rates/status/886366144...
29
                                                                        12
      https://twitter.com/dog_rates/status/666411507...
                                                                         2
2326
      https://twitter.com/dog_rates/status/666407126...
                                                                         7
2327
2328
      https://twitter.com/dog_rates/status/666396247...
                                                                         9
      https://twitter.com/dog_rates/status/666373753...
2329
                                                                         11
      https://twitter.com/dog_rates/status/666362758...
2330
                                                                         6
2331
      https://twitter.com/dog_rates/status/666353288...
                                                                         8
      https://twitter.com/dog_rates/status/666345417...
                                                                         10
2332
      https://twitter.com/dog_rates/status/666337882...
                                                                         9
2333
      https://twitter.com/dog_rates/status/666293911...
                                                                         3
2334
      https://twitter.com/dog_rates/status/666287406...
2335
                                                                         1
2336
      https://twitter.com/dog_rates/status/666273097...
                                                                         11
      https://twitter.com/dog_rates/status/666268910...
2337
                                                                         10
2338
      https://twitter.com/dog_rates/status/666104133...
                                                                         1
      https://twitter.com/dog_rates/status/666102155...
2339
                                                                         11
2340
      https://twitter.com/dog_rates/status/666099513...
                                                                         8
2341
      https://twitter.com/dog_rates/status/666094000...
                                                                         9
      https://twitter.com/dog_rates/status/666082916...
2342
                                                                         6
      https://twitter.com/dog_rates/status/666073100...
                                                                         10
2343
2344
      https://twitter.com/dog_rates/status/666071193...
                                                                         9
      https://twitter.com/dog_rates/status/666063827...
2345
                                                                         10
     https://twitter.com/dog_rates/status/666058600...
2346
                                                                         8
      https://twitter.com/dog_rates/status/666057090...
2347
                                                                         9
      https://twitter.com/dog_rates/status/666055525...
2348
                                                                        10
2349
      https://twitter.com/dog_rates/status/666051853...
                                                                         2
      https://twitter.com/dog_rates/status/666050758...
2350
                                                                         10
      https://twitter.com/dog_rates/status/666049248...
                                                                         5
2351
      https://twitter.com/dog_rates/status/666044226...
2352
                                                                         6
2353
      https://twitter.com/dog_rates/status/666033412...
                                                                         9
2354
      https://twitter.com/dog_rates/status/666029285...
                                                                         7
```

	rating_denominator	name	doggo	floofer	pupper	puppo
0	10	Phineas	None	None	None	None
1	10	Tilly	${\tt None}$	None	None	${\tt None}$
2	10	Archie	${\tt None}$	None	None	${\tt None}$
3	10	Darla	None	None	None	None
4	10	Franklin	None	None	None	${\tt None}$
5	10	None	None	None	None	None
6	10	Jax	None	None	None	None
7	10	None	None	None	None	None
8	10	Zoey	${\tt None}$	None	None	${\tt None}$
9	10	Cassie	doggo	None	None	None
10	10	Koda	None	None	None	None
11	10	${\tt Bruno}$	${\tt None}$	None	None	${\tt None}$
12	10	None	None	None	None	puppo
13	10	Ted	None	None	None	None
14	10	Stuart	${\tt None}$	None	None	puppo
15	10	Oliver	${\tt None}$	None	${\tt None}$	${\tt None}$
16	10	Jim	None	None	None	${\tt None}$
17	10	Zeke	None	None	None	None
18	10	Ralphus	None	None	${\tt None}$	${\tt None}$
19	10	Canela	None	None	None	None
20	10	Gerald	None	None	None	None
21	10	Jeffrey	None	None	None	None
22	10	such	None	None	None	None
23	10	Canela	None	None	None	None
24	10	None	None	None	None	None
25	10	None	None	None	None	None
26	10	Maya	${\tt None}$	None	None	${\tt None}$
27	10	Mingus	None	None	None	${\tt None}$
28	10	Derek	None	None	None	None
29	10	Roscoe	None	None	pupper	None
2326	10	quite	None	None	None	None
2327	10	a	None	None	None	None
2328	10	None	None	None	None	None
2329	10	None	None	None	None	None
2330	10	None	None	None	None	None
2331	10	None	None	None	None	None
2332	10	None	None	None	None	None
2333	10	an	None	None	None	None
2334	10	a	None	None	None	None
2335	2	an	None	None	None	None
2336	10	None	None	None	None	None
2337	10	None	None	None	None	None
2338	10	None	None	None	None	None
2339	10	None	None	None	None	None

2340	10	None	None	None	None	None
2341	10	None	None	None	None	None
2342	10	None	None	None	None	None
2343	10	None	None	None	None	None
2344	10	None	None	None	None	None
2345	10	the	None	None	None	None
2346	10	the	None	None	None	None
2347	10	a	None	None	None	None
2348	10	a	None	None	None	None
2349	10	an	None	None	None	None
2350	10	a	None	None	None	None
2351	10	None	None	None	None	None
2352	10	a	None	None	None	None
2353	10	a	None	None	None	None
2354	10	a	None	None	None	None
2355	10	None	None	None	None	None

[2356 rows x 17 columns]

archive table has 2356 rows and 17 columns These dog stage columns are too redundent (doggo, floofer, pupper, and puppo, which re-...) --> merge them into one dog_stage column. sult into a tidyness issue. 2. in_reply_to_status_id,in_reply_to_user_idretweeted_status_id,retweeted_status_user_id retweeted_status_timestamp have a lot of missing value --> examine more in programmatical portion. 3. Timestamp variable has the suffix '+0000". 4. Source column's value has "<a href=" and ".r" around text. some rows have the same source url. 5. Some naame variable has 'a', 'an' and 'the'.

6. The value inside 'text' is incomplete.

In [9]: imagePrediction

```
Out[9]:
                        tweet_id
                                                                              jpg_url
        0
              666020888022790149
                                     https://pbs.twimg.com/media/CT4udnOWwAAOaMy.jpg
                                     https://pbs.twimg.com/media/CT42GRgUYAA5iDo.jpg
        1
              666029285002620928
        2
              666033412701032449
                                     https://pbs.twimg.com/media/CT4521TWwAEvMyu.jpg
        3
              666044226329800704
                                     https://pbs.twimg.com/media/CT5Dr8HUEAA-1Eu.jpg
        4
              666049248165822465
                                     https://pbs.twimg.com/media/CT5IQmsXIAAKY4A.jpg
        5
              666050758794694657
                                     https://pbs.twimg.com/media/CT5Jof1WUAEuVxN.jpg
        6
              666051853826850816
                                     https://pbs.twimg.com/media/CT5KoJ1WoAAJash.jpg
                                     https://pbs.twimg.com/media/CT5N9tpXIAAifs1.jpg
        7
              666055525042405380
                                     https://pbs.twimg.com/media/CT5PY90WoAAQGLo.jpg
        8
              666057090499244032
                                     https://pbs.twimg.com/media/CT5Qw94XAAA_2dP.jpg
        9
              666058600524156928
                                     https://pbs.twimg.com/media/CT5Vg_wXIAAXfnj.jpg
        10
              666063827256086533
        11
              666071193221509120
                                     https://pbs.twimg.com/media/CT5cN_3WEAA10oZ.jpg
        12
              666073100786774016
                                     https://pbs.twimg.com/media/CT5d9DZXAAALcwe.jpg
                                     https://pbs.twimg.com/media/CT5m4VGWEAAtKc8.jpg
        13
              666082916733198337
                                     https://pbs.twimg.com/media/CT5w9gUW4AAsBNN.jpg
        14
              666094000022159362
        15
              666099513787052032
                                     https://pbs.twimg.com/media/CT51-JJUEAA6hV8.jpg
```

```
666102155909144576
                            https://pbs.twimg.com/media/CT54YGiWUAEZnoK.jpg
16
                            https://pbs.twimg.com/media/CT56LSZWoAAlJj2.jpg
17
      666104133288665088
      666268910803644416
                            https://pbs.twimg.com/media/CT8QCd1WEAADXws.jpg
18
                            https://pbs.twimg.com/media/CT8T1mtUwAA3aqm.jpg
19
      666273097616637952
                            https://pbs.twimg.com/media/CT8g3BpUEAAuFjg.jpg
20
      666287406224695296
                            https://pbs.twimg.com/media/CT8mx7KW4AEQu8N.jpg
21
      666293911632134144
22
      666337882303524864
                            https://pbs.twimg.com/media/CT90wFIWEAMuRje.jpg
23
      666345417576210432
                            https://pbs.twimg.com/media/CT9Vn7PWoAA_ZCM.jpg
                            https://pbs.twimg.com/media/CT9cxOtUEAAhNN_.jpg
24
      666353288456101888
25
      666362758909284353
                            https://pbs.twimg.com/media/CT9lXGsUcAAyUFt.jpg
26
      666373753744588802
                            https://pbs.twimg.com/media/CT9vZEYWUAA1Z05.jpg
27
                            https://pbs.twimg.com/media/CT-D2ZHWIAA3gK1.jpg
      666396247373291520
28
      666407126856765440
                            https://pbs.twimg.com/media/CT-NvwmW4AAugGZ.jpg
                            https://pbs.twimg.com/media/CT-RugiWIAELEaq.jpg
29
      666411507551481857
. . .
      886366144734445568
                            https://pbs.twimg.com/media/DEOBTnQUwAApKEH.jpg
2045
2046
      886680336477933568
                            https://pbs.twimg.com/media/DE4fEDzWAAAyHMM.jpg
2047
                            https://pbs.twimg.com/media/DE5Se8FXcAAJFx4.jpg
      886736880519319552
      886983233522544640
                            https://pbs.twimg.com/media/DE8yicJWOAAAvBJ.jpg
2048
2049
      887101392804085760
                            https://pbs.twimg.com/media/DE-eAq6UwAA-jaE.jpg
2050
      887343217045368832
                          https://pbs.twimg.com/ext_tw_video_thumb/88734...
                            https://pbs.twimg.com/media/DFDw2tyUQAAAFke.jpg
2051
      887473957103951883
2052
      887517139158093824
                          https://pbs.twimg.com/ext_tw_video_thumb/88751...
                            https://pbs.twimg.com/media/DFHDQBbXgAEqY7t.jpg
2053
      887705289381826560
2054
      888078434458587136
                            https://pbs.twimg.com/media/DFMWn56WsAAkA7B.jpg
                            https://pbs.twimg.com/media/DFDw2tyUQAAAFke.jpg
2055
      888202515573088257
      888554962724278272
                            https://pbs.twimg.com/media/DFTH_O-UQAACu20.jpg
2056
                            https://pbs.twimg.com/media/DFWra-3VYAA2piG.jpg
2057
      888804989199671297
                            https://pbs.twimg.com/media/DFYRgsOUQAARGhO.jpg
2058
      888917238123831296
2059
      889278841981685760
                          https://pbs.twimg.com/ext_tw_video_thumb/88927...
2060
      889531135344209921
                            https://pbs.twimg.com/media/DFg_2PVWOAEHN3p.jpg
2061
      889638837579907072
                            https://pbs.twimg.com/media/DFihzFfXsAYGDPR.jpg
2062
      889665388333682689
                            https://pbs.twimg.com/media/DFi579UWsAAatzw.jpg
2063
      889880896479866881
                            https://pbs.twimg.com/media/DF199B1WsAITKsg.jpg
                            https://pbs.twimg.com/media/DFnwSY4WAAAMliS.jpg
2064
      890006608113172480
2065
      890240255349198849
                            https://pbs.twimg.com/media/DFrEyVuWOAAO3t9.jpg
2066
      890609185150312448
                            https://pbs.twimg.com/media/DFwUU__XcAEpyXI.jpg
2067
      890729181411237888
                            https://pbs.twimg.com/media/DFyBahAVwAAhUTd.jpg
                            https://pbs.twimg.com/media/DF1eOmZXUAALUcq.jpg
2068
      890971913173991426
2069
      891087950875897856
                            https://pbs.twimg.com/media/DF3HwyEWsAABqE6.jpg
      891327558926688256
                            https://pbs.twimg.com/media/DF6hr6BUMAAzZgT.jpg
2070
                            https://pbs.twimg.com/media/DF_q7IAWsAEuuN8.jpg
2071
      891689557279858688
2072
                            https://pbs.twimg.com/media/DGBdLU1WsAANxJ9.jpg
      891815181378084864
                            https://pbs.twimg.com/media/DGGmoV4XsAAUL6n.jpg
2073
      892177421306343426
2074
     892420643555336193
                            https://pbs.twimg.com/media/DGKD1-bXoAAIAUK.jpg
                                              p1_conf
                                                       p1_dog
      img_num
                                         р1
0
                    Welsh_springer_spaniel 0.465074
            1
                                                         True
```

1	1	redbone	0.506826	True
2	1	German_shepherd	0.596461	True
3	1	Rhodesian_ridgeback	0.408143	True
4	1	miniature_pinscher	0.560311	True
5	1	Bernese_mountain_dog	0.651137	True
6	1	box_turtle	0.933012	False
7	1	chow	0.692517	True
8	1	shopping_cart	0.962465	False
9	1	miniature_poodle	0.201493	True
10	1	golden_retriever	0.775930	True
11	1	Gordon_setter	0.503672	True
12	1	Walker_hound	0.260857	True
13	1		0.489814	True
14	1	pug bloodhound	0.195217	True
15	1	Lhasa	0.133217	True
16	1	English_setter	0.298617	True
17	1	hen	0.965932	False
18	1	desktop_computer	0.086502	False
19	1	Italian_greyhound	0.176053	True
20	1	Maltese_dog	0.857531	True
21	1	three-toed_sloth	0.914671	False
22	1	OX	0.416669	False
23	1	golden_retriever	0.858744	True
24	1	malamute	0.336874	True
25	1	guinea_pig	0.996496	False
26	1	soft-coated_wheaten_terrier	0.326467	True
27	1	Chihuahua	0.978108	True
28	1	black-and-tan_coonhound	0.529139	True
29	1	coho	0.404640	False
			0.101010	
2045	1	French_bulldog	0.999201	True
2046	1	convertible	0.738995	False
2047	1	kuvasz	0.309706	True
2048	2	Chihuahua	0.793469	True
2049	1	Samoyed	0.733942	True
2050	1	Mexican_hairless	0.330741	True
2051	2	- Pembroke	0.809197	True
2052	1	limousine	0.130432	False
2053	1	basset	0.821664	True
2054	1	French_bulldog	0.995026	True
2055	2	Pembroke	0.809197	True
2056	3	Siberian_husky	0.700377	True
2057	1	golden_retriever	0.469760	True
2058	1	golden_retriever	0.714719	True
2059	1	whippet	0.626152	True
2060	1	golden_retriever	0.953442	True
2061	1	French_bulldog	0.991650	True
2062	1	Pembroke	0.966327	True
	_			

2063	1 Fre	ench_bulldog	0.377	417 True	
2064	1	Samoyed	0.957	979 True	
2065	1	Pembroke	0.511	319 True	
2066	1 Ir	rish_terrier	0.487	574 True	
2067	2	Pomeranian	0.566	142 True	
2068	1	Appenzeller	0.341	703 True	
2069	1 Chesapeake_Ba	ay_retriever	0.425	595 True	
2070	2	basset	0.555	712 True	
2071	1	paper_towel	0.170	278 False	
2072	1	Chihuahua	0.716	012 True	
2073	1	Chihuahua	0.323	581 True	
2074	1	orange	0.097	049 False	
	p2	p2_conf	no dom	£q	\
0	collie	0.156665	p2_dog True	Shetland_sheepdog	\
1	miniature_pinscher	0.130003	True	Rhodesian_ridgeback	
2	malinois	0.074132	True	bloodhound	
3	redbone	0.360687	True	miniature_pinscher	
4	Rottweiler	0.243682	True	Doberman	
5	English_springer	0.243082	True	Greater_Swiss_Mountain_dog	
6	mud_turtle	0.045885	False	terrapin	
7	Tibetan_mastiff	0.058279	True	fur_coat	
8	shopping_basket	0.014594	False	golden_retriever	
9	komondor	0.192305	True	soft-coated_wheaten_terrier	
10	Tibetan_mastiff	0.093718	True	Labrador_retriever	
11	Yorkshire_terrier	0.174201	True	Pekinese	
12	English_foxhound	0.175382	True	Ibizan_hound	
13	bull_mastiff	0.404722	True	- French_bulldog	
14	German_shepherd	0.078260	True	malinois	
15	Shih-Tzu	0.166192	True	Dandie_Dinmont	
16	Newfoundland	0.149842	True	borzoi	
17	cock	0.033919	False	partridge	
18	desk	0.085547	False	bookcase	
19	toy_terrier	0.111884	True	basenji	
20	toy_poodle	0.063064	True	miniature_poodle	
21	otter	0.015250	False	great_grey_owl	
22	Newfoundland	0.278407	True	groenendael	
23	Chesapeake_Bay_retriever	0.054787	True	Labrador_retriever	
24	Siberian_husky	0.147655	True	Eskimo_dog	
25	skunk	0.002402	False	hamster	
26	${\tt Afghan_hound}$	0.259551	True	briard	
27	toy_terrier	0.009397	True	papillon	
28	bloodhound	0.244220	True	flat-coated_retriever	
29	barracouta	0.271485	False	gar	
2045	Chihuahua	0.000361	True	Boston_bull	
2046	sports_car	0.139952	False	car_wheel	
2047	Great_Pyrenees	0.186136	True	Dandie_Dinmont	

2048	toy_terrier	0.143528	True	can_opener
2049	Eskimo_dog	0.035029	True	Staffordshire_bullterrier
2050	sea_lion	0.275645	False	Weimaraner
2051	Rhodesian_ridgeback	0.054950	True	beagle
2052	tow_truck	0.029175	False	shopping_cart
2053	redbone	0.087582	True	Weimaraner
2054	pug	0.000932	True	${\tt bull_mastiff}$
2055	Rhodesian_ridgeback	0.054950	True	beagle
2056	Eskimo_dog	0.166511	True	malamute
2057	Labrador_retriever	0.184172	True	${\tt English_setter}$
2058	Tibetan_mastiff	0.120184	True	Labrador_retriever
2059	borzoi	0.194742	True	Saluki
2060	Labrador_retriever	0.013834	True	redbone
2061	boxer	0.002129	True	Staffordshire_bullterrier
2062	Cardigan	0.027356	True	basenji
2063	Labrador_retriever	0.151317	True	muzzle
2064	Pomeranian	0.013884	True	chow
2065	Cardigan	0.451038	True	Chihuahua
2066	${\tt Irish_setter}$	0.193054	True	${ t Chesapeake_Bay_retriever}$
2067	Eskimo_dog	0.178406	True	Pembroke
2068	Border_collie	0.199287	True	ice_lolly
2069	Irish_terrier	0.116317	True	${\tt Indian_elephant}$
2070	${ t English_springer}$	0.225770	True	<pre>German_short-haired_pointer</pre>
2071	Labrador_retriever	0.168086	True	spatula
2072	malamute	0.078253	True	kelpie
2073	Pekinese	0.090647	True	papillon
2074	bagel	0.085851	False	banana

	p3_conf	p3_dog
0	0.061428	True
1	0.072010	True
2	0.116197	True
3	0.222752	True
4	0.154629	True
5	0.016199	True
6	0.017885	False
7	0.054449	False
8	0.007959	True
9	0.082086	True
10	0.072427	True
11	0.109454	True
12	0.097471	True
13	0.048960	True
14	0.075628	True
15	0.089688	True
16	0.133649	True
17	0.000052	False
18	0.079480	False

```
19
      0.111152
                   True
20
      0.025581
                   True
21
      0.013207
                  False
22
      0.102643
                   True
23
      0.014241
                   True
      0.093412
24
                   True
25
      0.000461
                  False
26
      0.206803
                   True
27
      0.004577
                   True
      0.173810
28
                   True
29
      0.189945
                  False
                    . . .
2045
     0.000076
                   True
2046
      0.044173
                  False
2047
      0.086346
                   True
2048
      0.032253
                  False
2049
      0.029705
                   True
2050
      0.134203
                   True
2051
     0.038915
                   True
2052
     0.026321
                  False
2053
      0.026236
                   True
      0.000903
2054
                   True
2055
     0.038915
                   True
2056
      0.111411
                   True
2057
      0.073482
                   True
      0.105506
2058
                   True
2059
      0.027351
                   True
2060
      0.007958
                   True
      0.001498
2061
                   True
2062
      0.004633
                   True
2063
      0.082981
                  False
2064
      0.008167
                   True
2065
      0.029248
                   True
2066
     0.118184
                   True
      0.076507
2067
                   True
2068
      0.193548
                  False
      0.076902
2069
                  False
2070
      0.175219
                   True
2071
      0.040836
                  False
      0.031379
2072
                   True
2073
      0.068957
                   True
      0.076110
2074
                  False
```

[2075 rows x 12 columns]

imagePrediction table has 2075 rows and 12 columns. 1. In p1, p2, p3 columns (breeds of dogs) 2. Three confidence have 6 decimals. 3. 'Newfoundland','Lhasa' in p2 and p1 are not a breed of dog, but indicator = TRUE

In [10]: tweet_json

Out[10]:		tweet id	retweet_count	favorite count
040[20]	0	1090301319825436672	2	305
	1	1090300780270149632	11	1226
	2	1090300624657252352	6989	79691
	3	1090060665903927296	1	143
	4	1090060504788197377	1	116
	5	1090058668987404289	58	1282
	6	1090055878013644800	3	1352
	7	1090054426788691968	10442	120078
	8	1090051186432958464	0	11
	9	1090006105990750209	0	102
	10	1089995552228487168	0	9
	11	1089984884951592963	0	8
	12	1089960608730992643	0	11
	13	1089933184110743552	3391	0
	14	1089608184073879552	169	6401
	15	1089589687897939969	0	135
	16	1089261994136416256	0	836
	17	1089259355805896706	11893	122218
	18	1089220307246665728	79	2550
	19	1089217280049729536	4205	0
	20	1089217166509916161	1	22
	21	1088950936670633985	11	725
	22	1088950484650479616	184	9256
	23	1088883158982905856	165033	0
	24	1088879155855294464	0	172
	25	1088868189495189504	13	753
	26	1088860190663790592	6569	50536
	27	1088552419842084864	0	33
	28	1088550291694223360	6265	0
	29	1088513633804419072	17	3152
	2127	1028067313101156352	0	0
	2128	1028067310592917504	0	0
	2129	1028067009894871040	0	0
	2130	1028066978173317120	0	0
	2131	1028066930538700800	0	0
	2132	1028066727190355968	0	0
	2133	1028066622202818560	0	0
	2134	1028066560189952000	0	0
	2135	1028066488630968320	0	0
	2136	1028066169834459137	0	0
	2137	1028065866615676928	0	0
	2138	1028065821619175425	0	0
	2139	1028063180747165696	1	5
	2140	1028051315493023746	0	0

2141	1028048323624591360	0	0
2142	1028040708266110976	0	3
2143	1028030559723765761	0	1
2144	1028029530957664268	0	5
2145	1028026872041492480	31134	154387
2146	1028024120414334976	0	1
2147	1028022323465646081	0	4
2148	1028020490080641029	0	0
2149	1027988812171898880	0	0
2150	1027987538554679296	0	0
2151	1027985302554595329	0	1
2152	1027980978910687233	0	0
2153	1027976875811819520	0	0
2154	1027970381766963202	0	2
2155	1027967697684815873	0	1
2156	1027963039029452800	0	0

[2157 rows x 3 columns]

tweet_json table has 3225 rows and 5 columns.

2. Programatical assessment

In [11]: archive.info()

2.1 archive table

floofer

pupper

puppo

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2356 entries, 0 to 2355
Data columns (total 17 columns):
                               2356 non-null int64
tweet_id
in_reply_to_status_id
                               78 non-null float64
                               78 non-null float64
in_reply_to_user_id
                               2356 non-null object
timestamp
source
                               2356 non-null object
                               2356 non-null object
text
retweeted_status_id
                               181 non-null float64
retweeted_status_user_id
                               181 non-null float64
{\tt retweeted\_status\_timestamp}
                               181 non-null object
                               2297 non-null object
expanded_urls
                               2356 non-null int64
rating_numerator
rating_denominator
                               2356 non-null int64
                               2356 non-null object
name
                               2356 non-null object
doggo
```

dtypes: float64(4), int64(3), object(10)

2356 non-null object 2356 non-null object

2356 non-null object

memory usage: 313.0+ KB

- 1. timestamp variable's type should be time format rather than string.
- 2. Expanded_urls,in_reply_to_status_id,in_reply_to_user_id only has 78 non-null value.
- 3. retweeted_status_id,retweeted_status_user_id and retweeted_status_timestamp have 2175 missing value
- 4. Tweet_ID should be string rather than numeric value

```
In [12]: archive.tail()
```

```
Out[12]:
                         tweet_id in_reply_to_status_id in_reply_to_user_id
         2351
               666049248165822465
                                                      {\tt NaN}
                                                                           {\tt NaN}
         2352 666044226329800704
                                                      NaN
                                                                           NaN
         2353 666033412701032449
                                                      NaN
                                                                           NaN
         2354 666029285002620928
                                                      NaN
                                                                           NaN
         2355 666020888022790149
                                                      NaN
                                                                           NaN
                               timestamp
         2351 2015-11-16 00:24:50 +0000
         2352 2015-11-16 00:04:52 +0000
         2353 2015-11-15 23:21:54 +0000
         2354 2015-11-15 23:05:30 +0000
         2355 2015-11-15 22:32:08 +0000
                                                           source \
         2351
              <a href="http://twitter.com/download/iphone" r...</pre>
         2352 <a href="http://twitter.com/download/iphone" r...
         2353 <a href="http://twitter.com/download/iphone" r...
         2354 <a href="http://twitter.com/download/iphone" r...
         2355 <a href="http://twitter.com/download/iphone" r...
                                                             text
                                                                  retweeted_status_id \
         2351 Here we have a 1949 1st generation vulpix. Enj...
                                                                                    NaN
         2352 This is a purebred Piers Morgan. Loves to Netf...
                                                                                    NaN
         2353 Here is a very happy pup. Big fan of well-main...
                                                                                    NaN
         2354 This is a western brown Mitsubishi terrier. Up...
                                                                                   NaN
         2355 Here we have a Japanese Irish Setter. Lost eye...
                                                                                   NaN
               retweeted_status_user_id retweeted_status_timestamp
         2351
                                    NaN
                                                                NaN
         2352
                                    NaN
                                                                NaN
         2353
                                    NaN
                                                                NaN
         2354
                                    NaN
                                                                NaN
         2355
                                    NaN
                                                                NaN
                                                    expanded_urls rating_numerator
         2351 https://twitter.com/dog_rates/status/666049248...
```

```
https://twitter.com/dog_rates/status/666044226...
         2352
                                                                                   6
         2353
               https://twitter.com/dog_rates/status/666033412...
                                                                                   9
         2354
               https://twitter.com/dog_rates/status/666029285...
                                                                                   7
         2355
               https://twitter.com/dog_rates/status/666020888...
                                                                                   8
               rating_denominator
                                   name doggo floofer pupper puppo
                                         None
                                                         None
         2351
                                    None
                                                  None
         2352
                                       a None
                                                  None
                                                         None
                                                               None
                                10
         2353
                                10
                                       a None
                                                  None
                                                         None None
         2354
                                10
                                       a None
                                                  None
                                                         None None
         2355
                                10
                                   None None
                                                  None
                                                         None None
In [13]: pd.set_option('display.max_colwidth', -1)
In [14]: archive['name'].value_counts()
Out[14]: None
                       745
                       55
         Charlie
                       12
         Lucy
                       11
         Oliver
                       11
         Cooper
                       11
         Tucker
                       10
         Penny
                       10
         Lola
                       10
                       9
         Во
         Winston
                       9
         the
                       8
         Sadie
                       8
         Toby
                       7
         Bailey
                       7
                       7
         an
                       7
         Buddy
         Daisy
                       7
                       6
         Bella
         Leo
                       6
         Koda
                       6
         Jax
                       6
         Scout
                       6
         Oscar
                       6
                       6
         Jack
         Milo
                       6
         Rusty
                       6
         Dave
                       6
         Stanley
                       6
         Bentley
                       5
         Karl
                       1
```

```
Katie
Jiminus
               1
Chesterson
               1
Goose
               1
Jessifer
               1
Tobi
               1
Rueben
               1
Sojourner
Karma
               1
Asher
               1
Rooney
               1
Shelby
               1
Wishes
               1
Rizzo
               1
all
               1
Spanky
Kawhi
               1
Willie
               1
Pepper
               1
Brian
               1
               1
Carter
Sephie
Chef
               1
Grizzwald
               1
Kobe
Eriq
               1
Brandonald
               1
Lizzie
               1
space
Name: name, Length: 957, dtype: int64
```

The name variable has 745 'None', 55 'a', 7 'an' name and 8 'the'.

In [15]: archive.rating_denominator.value_counts()

```
Out[15]: 10
                  2333
          11
                  3
          50
                  3
          80
                  2
          20
                  2
          2
                  1
          16
                  1
          40
          70
                  1
          15
                  1
          90
                  1
          110
                  1
          120
                  1
```

```
130
        150
               1
        170
        Name: rating_denominator, dtype: int64
  There is 1 record with denominator = 0, which is invalid rating.
In [16]: archive[archive['rating_denominator'] ==0]
Out[16]:
                       tweet_id in_reply_to_status_id in_reply_to_user_id \
        313 835246439529840640 8.352460e+17
                                                         26259576.0
                              timestamp \
        313 2017-02-24 21:54:03 +0000
                                                                                          source
        313 <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
        313 @jonnysun @Lin_Manuel ok jomny I know you're excited but 960/00 isn't a valid rati
             retweeted_status_id retweeted_status_user_id retweeted_status_timestamp \
         313 NaN
                                  NaN
                                                             NaN
             expanded_urls rating_numerator rating_denominator name doggo floofer \
         313 NaN
                           960
                                                                 None None None
             pupper puppo
        313 None
                   None
In [17]: archive[archive['rating_denominator'] ==2]
Out[17]:
                         tweet_id in_reply_to_status_id in_reply_to_user_id \
         2335 666287406224695296 NaN
                                                         NaN
                              timestamp \
         2335 2015-11-16 16:11:11 +0000
         2335 <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
         2335 This is an Albanian 3 1/2 legged Episcopalian. Loves well-polished hardwood floo
              retweeted_status_id retweeted_status_user_id \
         2335 NaN
                                   NaN
```

```
retweeted_status_timestamp \
         2335 NaN
                                                                 expanded_urls \
         2335 https://twitter.com/dog_rates/status/666287406224695296/photo/1
              rating_numerator rating_denominator name doggo floofer pupper puppo
         2335 1
                                                          None None
                                                                               None
In [18]: archive[archive['rating_denominator'] ==7]
Out[18]:
                       tweet_id in_reply_to_status_id in_reply_to_user_id \
        516 810984652412424192 NaN
                                                        NaN
                              timestamp \
         516 2016-12-19 23:06:23 +0000
                                                                                          source
         516 <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
        516 Meet Sam. She smiles 24/7 & amp; secretly aspires to be a reindeer. \nKeep Sam smil
             retweeted_status_id retweeted_status_user_id retweeted_status_timestamp \
         516 NaN
                                 NaN
                                                            NaN
         516 https://www.gofundme.com/sams-smile, https://twitter.com/dog_rates/status/810984652
             rating_numerator rating_denominator name doggo floofer pupper puppo
         516 24
                                                    Sam None None
                                                                      None
In [19]: archive[archive['rating_denominator'] ==11]
Out[19]:
                         tweet_id in_reply_to_status_id in_reply_to_user_id \
        784
              775096608509886464 NaN
                                                        NaN
         1068 740373189193256964 NaN
                                                        NaN
         1662 682962037429899265 NaN
                                                        NaN
                               timestamp \
         784
              2016-09-11 22:20:06 +0000
         1068 2016-06-08 02:41:38 +0000
         1662 2016-01-01 16:30:13 +0000
                                                                                           sourc
              <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
         784
         1068 <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
```

1662 Twitter for iPhone</a

```
784
                                                                         RT @dog_rates: After so many requests, this is Bretagne. She was the last survivi
                                            1068 After so many requests, this is Bretagne. She was the last surviving 9/11 search
                                            1662 This is Darrel. He just robbed a 7/11 and is in a high speed police chase. Was ju
                                                                         retweeted_status_id retweeted_status_user_id \
                                            784
                                                                         7.403732e+17
                                                                                                                                                                                 4.196984e+09
                                            1068 NaN
                                                                                                                                                                            NaN
                                            1662 NaN
                                                                                                                                                                            NaN
                                                                     retweeted_status_timestamp \
                                                                         2016-06-08 02:41:38 +0000
                                            784
                                            1068 NaN
                                            1662 NaN
                                            784
                                                                         https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status/status
                                            1068 https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/740373189193256964/photo/1,https://twitter.com/dog_rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rate
                                            1662 https://twitter.com/dog_rates/status/682962037429899265/photo/1
                                                                         rating_numerator rating_denominator
                                                                                                                                                                                                                                                                              name doggo floofer pupper puppo
                                                                                                                                                                                                                                                                                                                                                                                  None
                                            784
                                                                                                                                                                   11
                                                                                                                                                                                                                                                                     None
                                                                                                                                                                                                                                                                                                             None None
                                                                                                                                                                                                                                                                                                                                                                                                                     None
                                            1068 9
                                                                                                                                                                   11
                                                                                                                                                                                                                                                                     None
                                                                                                                                                                                                                                                                                                             None None
                                                                                                                                                                                                                                                                                                                                                                                  None
                                                                                                                                                                                                                                                                                                                                                                                                                     None
                                            1662 7
                                                                                                                                                                                                                                                                     Darrel None None
                                                                                                                                                                                                                                                                                                                                                                                  None
                                                                                                                                                                                                                                                                                                                                                                                                                    None
                                                                                                                                                                   11
In [20]: archive.rating_numerator.value_counts()
Out[20]: 12
                                                                                    558
                                            11
                                                                                    464
                                            10
                                                                                    461
                                            13
                                                                                    351
                                            9
                                                                                    158
                                            8
                                                                                    102
                                            7
                                                                                    55
                                            14
                                                                                    54
                                            5
                                                                                    37
                                            6
                                                                                    32
                                            3
                                                                                    19
                                            4
                                                                                    17
                                            1
                                                                                    9
                                            2
                                                                                    9
                                            420
                                                                                    2
                                                                                    2
                                            0
                                            15
                                                                                    2
                                            75
                                                                                    2
                                            80
                                                                                    1
                                            20
                                                                                   1
                                            24
                                                                                    1
```

```
26
                1
        44
                1
        50
                1
        60
        165
        84
        88
        144
        182
        143
        666
        960
        1776
        17
        27
        45
        99
        121
                1
        204
                 1
        Name: rating_numerator, dtype: int64
In [21]: archive[archive['rating_numerator'] == 1776]
Out[21]:
                       tweet_id in_reply_to_status_id in_reply_to_user_id \
        979 749981277374128128 NaN
                                                       NaN
                             timestamp \
         979 2016-07-04 15:00:45 +0000
        979 <a href="https://about.twitter.com/products/tweetdeck" rel="nofollow">TweetDeck</a
                                                                                        text \
        979 This is Atticus. He's quite simply America af. 1776/10 https://t.co/GRXwMxLBkh
             retweeted_status_id retweeted_status_user_id retweeted_status_timestamp \
        979 NaN
                                 NaN
                                                             NaN
                                                                expanded_urls \
             https://twitter.com/dog_rates/status/749981277374128128/photo/1
             rating_numerator rating_denominator
                                                      name doggo floofer pupper puppo
        979 1776
                                                   Atticus None None
                                                                          None
                                                                                 None
In [22]: archive[archive['rating_numerator'] ==0]
Out[22]:
                        tweet_id in_reply_to_status_id in_reply_to_user_id \
        315
              835152434251116546 NaN
         1016 746906459439529985 7.468859e+17
                                                         4.196984e+09
```

```
timestamp \
        315
              2017-02-24 15:40:31 +0000
         1016 2016-06-26 03:22:31 +0000
               <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
         1016 <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
        315
              When you're so blinded by your systematic plagiarism that you forget what day it
         1016 PUPDATE: can't see any. Even if I could, I couldn't reach them to pet. 0/10 much
              retweeted_status_id retweeted_status_user_id \
         315 NaN
                                   NaN
         1016 NaN
                                   NaN
              retweeted_status_timestamp \
        315
              NaN
         1016 NaN
              https://twitter.com/dog_rates/status/835152434251116546/photo/1,https://twitter.c
         1016 https://twitter.com/dog_rates/status/746906459439529985/photo/1
              rating_numerator rating_denominator name doggo floofer pupper puppo
         315
                                                     None None None
                                                                         None
                                 10
                                                                                None
         1016 0
                                 10
                                                     None None None
                                                                         None
                                                                                None
In [23]: archive[archive['rating_numerator'] == 5]
Out [23]:
                         tweet_id in_reply_to_status_id in_reply_to_user_id \
        45
              883482846933004288 NaN
                                                         NaN
        730
              781661882474196992 NaN
                                                         NaN
              751583847268179968 NaN
                                                         NaN
         956
         1399 699691744225525762 NaN
                                                         NaN
         1461 694925794720792577 NaN
                                                         NaN
         1508 691483041324204033 NaN
                                                         NaN
         1583 687102708889812993 NaN
                                                         NaN
         1618 684969860808454144 6.849598e+17
                                                         4.196984e+09
         1619 684959798585110529 NaN
                                                         NaN
         1624 684880619965411328 NaN
                                                         NaN
         1645 683849932751646720 NaN
                                                         NaN
         1680 682003177596559360 NaN
                                                         NaN
                                                         4.196984e+09
         1689 681340665377193984 6.813394e+17
         1727 679877062409191424 NaN
                                                         NaN
         1796 677301033169788928 NaN
                                                         NaN
         1808 676897532954456065 NaN
                                                         NaN
```

1820	676588346097852417 NaN	NaN
1861	675483430902214656 NaN	NaN
1874	675135153782571009 NaN	NaN
1901	674646392044941312 NaN	NaN
1904	674632714662858753 NaN	NaN
1925	674063288070742018 NaN	NaN
1979	672980819271634944 NaN	NaN
2013	672231046314901505 NaN	NaN
2026	671879137494245376 NaN	NaN
2063	671159727754231808 NaN	NaN
2092	670782429121134593 NaN	NaN
2109	670449342516494336 NaN	NaN
2134	670069087419133954 NaN	NaN
2139	670037189829525505 NaN	NaN
2153	669661792646373376 NaN	NaN
2181	668994913074286592 NaN	NaN
2206	668631377374486528 NaN	NaN
2242	667911425562669056 NaN	NaN
2260	667550882905632768 NaN	NaN
2312	666776908487630848 NaN	NaN
2351	666049248165822465 NaN	NaN
	$\texttt{timestamp} \hspace{0.2cm} \setminus$	
45	2017-07-08 00:28:19 +0000	
730	2016-09-30 01:08:10 +0000	
956	2016-07-09 01:08:47 +0000	
1399	2016-02-16 20:28:06 +0000	
1461	2016-02-03 16:49:55 +0000	
1508	2016-01-25 04:49:38 +0000	
1583	2016-01-13 02:43:46 +0000	
1618	2016-01-07 05:28:35 +0000	
1619	2016-01-07 04:48:36 +0000	
1624	2016-01-06 23:33:58 +0000	
1645	2016-01-04 03:18:23 +0000	
1680	2015-12-30 01:00:03 +0000	
1689	2015-12-28 05:07:27 +0000	
1727	2015-12-24 04:11:37 +0000	
1796	2015-12-17 01:35:24 +0000	
1808	2015-12-15 22:52:02 +0000	
1820	2015-12-15 02:23:26 +0000	
1861	2015-12-12 01:12:54 +0000	
1874	2015-12-11 02:08:58 +0000	
1901	2015-12-09 17:46:48 +0000	
1904	2015-12-09 16:52:27 +0000	

1925 2015-12-08 03:09:46 +0000 1979 2015-12-05 03:28:25 +0000 2013 2015-12-03 01:49:05 +0000 2026 2015-12-02 02:30:43 +0000

```
2109 2015-11-28 03:49:14 +0000
2134 2015-11-27 02:38:14 +0000
2139 2015-11-27 00:31:29 +0000
2153 2015-11-25 23:39:47 +0000
2181 2015-11-24 03:29:51 +0000
2206 2015-11-23 03:25:17 +0000
2242 2015-11-21 03:44:27 +0000
2260 2015-11-20 03:51:47 +0000
2312 2015-11-18 00:36:17 +0000
2351 2015-11-16 00:24:50 +0000
                                                                                   sourc
45
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
730
956
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1399
      <a href="http://vine.co" rel="nofollow">Vine - Make a Scene</a>
1461
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1508
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1618
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1619
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1624
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1645
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1680
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1689
1727
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1796
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a</pre>
1808
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1820
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1861
1874
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1901
1904
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1925
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a</pre>
2013
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
2026
2063
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone/a
2092
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
2109
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
2134
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a</pre>
2153
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
2181
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
2206
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
2242
```

2015-11-30 02:52:03 +0000

2092 2015-11-29 01:52:48 +0000

2063

```
2312 <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
2351
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
     This is Bella. She hopes her smile made you smile. If not, she is also offering y
45
730
     Who keeps sending in pictures without dogs in them? This needs to stop. 5/10 for
956
     Please stop sending it pictures that don't even have a doggo or pupper in them. O
1399
     This is Dave. He's a tropical pup. Short lil legs (dachshund mix?) Excels underwa
     Please only send in dogs. This t-rex is very scary. 5/10 ...might still pet (vid
1461
1508
     When bae says they can't go out but you see them with someone else that same night
     Army of water dogs here. None of them know where they're going. Have no real purp
1583
     For those who claim this is a goat, u are wrong. It is not the Greatest Of All Ti
1618
     This is Jerry. He's a neat dog. No legs (tragic). Has more horns than a dog usual
1624
     Here we have a basking dino pupper. Looks powerful. Occasionally shits eggs. Does
1645
     This is Jiminy. He's not the brightest dog. Needs to lay off the kibble. 5/10 sti
1680
     Unique dog here. Wrinkly as hell. Weird segmented neck. Finger on fire. Doesn't s
1689
     I've been told there's a slight possibility he's checking his mirror. We'll bump
1727 Meet Penelope. She's a bacon frise. Total babe (lol get it like the movie). Doesn
1796
     This is Juckson. He's totally on his way to a nascar race. 5/10 for Juckson https
1808 Exotic handheld dog here. Appears unathletic. Feet look deadly. Can be thrown a g
1820 This is Bubbles. He kinda resembles a fish. Always makes eye contact with u no ma
1861 Rare shielded battle dog here. Very happy about abundance of lettuce. Painfully s
1874
     This is Steven. He got locked outside. Damn it Steven. 5/10 nice grill tho https:
     Two gorgeous dogs here. Little waddling dog is a rebel. Refuses to look at camera
1901
1904 Rare submerged pup here. Holds breath for a long time. Frowning because that spoo
1925
     This is Earl. Earl is lost. Someone help Earl. He has no tags. Just trying to get
1979 Extraordinary dog here. Looks large. Just a head. No body. Rather intrusive. 5/10
2013
     Exotic underwater dog here. Very shy. Wont return tennis balls I toss him. Never
2026 This is Brad. He's a chubby lil pup. Doesn't really need the food he's trying to
2063
     This is Anthony. He just finished up his masters at Harvard. Unprofessional tatto
2092 This dude slaps your girl's ass what do you do?\n5/10 https://t.co/6dioUL6gcP
2109 Vibrant dog here. Fabulous tail. Only 2 legs tho. Has wings but can barely fly (1
2134
     This is Randall. He's from Chernobyl. Built playground himself. Has been stuck up
     Awesome dog here. Not sure where it is tho. Spectacular camouflage. Enjoys leaves
2139
     This is a brave dog. Excellent free climber. Trying to get closer to God. Not ver
     Two gorgeous pups here. Both have cute fake horns(adorable). Barn in the back loc
2206 Meet Zeek. He is a grey Cumulonimbus. Zeek is hungry. Someone should feed Zeek as
2242 Wow. Armored dog here. Ready for battle. Face looks dangerous. Not very loyal. Li
2260 RT @dogratingrating: Unoriginal idea. Blatant plagiarism. Curious grammar. -5/10
2312 This is Josep. He is a Rye Manganese mix. Can drive w eyes closed. Very irrespons
2351 Here we have a 1949 1st generation vulpix. Enjoys sweat tea and Fox News. Cannot
```

Twitter Web Client

2260

retweeted_status_id retweeted_status_user_id \ 45 NaN NaN 730 NaN NaN 956 NaN NaN 1399 NaN NaN

```
1461 NaN
                             NaN
1508 NaN
                             NaN
1583 NaN
                             NaN
1618 NaN
                             NaN
1619 NaN
                             NaN
1624 NaN
                             NaN
1645 NaN
                             NaN
1680 NaN
                             NaN
1689 NaN
                             NaN
1727 NaN
                             NaN
1796 NaN
                             NaN
1808 NaN
                             NaN
1820 NaN
                             NaN
1861 NaN
                             NaN
1874 NaN
                             NaN
1901 NaN
                             NaN
1904 NaN
                             NaN
1925 NaN
                             NaN
1979 NaN
                             NaN
2013 NaN
                             NaN
2026 NaN
                             NaN
2063 NaN
                             NaN
2092 NaN
                             NaN
2109 NaN
                             NaN
2134 NaN
                             NaN
2139 NaN
                             NaN
2153 NaN
                             NaN
2181 NaN
                             NaN
2206 NaN
                             NaN
2242 NaN
                             NaN
2260 6.675484e+17
                              4.296832e+09
2312 NaN
                             NaN
2351 NaN
                             NaN
     retweeted_status_timestamp \
45
      {\tt NaN}
730
      NaN
956
      NaN
1399
      {\tt NaN}
1461
      {\tt NaN}
1508
      {\tt NaN}
1583
      NaN
1618
      NaN
1619
      NaN
1624
      {\tt NaN}
1645
      NaN
1680
      NaN
1689
      {\tt NaN}
```

```
1727
     NaN
1796 NaN
1808
     {\tt NaN}
1820
     {\tt NaN}
1861
     NaN
1874
     {\tt NaN}
1901
     NaN
1904 NaN
1925 NaN
1979
     NaN
2013
     {\tt NaN}
2026
     {\tt NaN}
2063
     {\tt NaN}
2092
     NaN
2109
     {\tt NaN}
2134
     NaN
2139
     {\tt NaN}
2153 NaN
2181
     NaN
2206 NaN
2242 NaN
2260 2015-11-20 03:41:59 +0000
2312 NaN
2351
     NaN
45
      https://twitter.com/dog_rates/status/883482846933004288/photo/1,https://twitter.c
730
      https://twitter.com/dog_rates/status/781661882474196992/photo/1
      https://twitter.com/dog_rates/status/751583847268179968/photo/1
956
     https://twitter.com/dog_rates/status/699691744225525762/photo/1
     https://vine.co/v/iJvUqWQ166L
1461
1508
     https://twitter.com/dog_rates/status/691483041324204033/photo/1,https://twitter.c
1583
     https://twitter.com/dog_rates/status/687102708889812993/photo/1
1618
     {\tt NaN}
1619
     https://twitter.com/dog_rates/status/684959798585110529/photo/1
1624 https://twitter.com/dog_rates/status/684880619965411328/photo/1
1645 https://twitter.com/dog_rates/status/683849932751646720/photo/1
1680
     https://twitter.com/dog_rates/status/682003177596559360/photo/1
1689
     {\tt NaN}
1727
     https://twitter.com/dog_rates/status/679877062409191424/photo/1
1796 https://twitter.com/dog_rates/status/677301033169788928/photo/1
1808 https://twitter.com/dog_rates/status/676897532954456065/photo/1
1820 https://twitter.com/dog_rates/status/676588346097852417/photo/1
     https://twitter.com/dog_rates/status/675483430902214656/photo/1
1874 https://twitter.com/dog_rates/status/675135153782571009/photo/1
1901
     https://twitter.com/dog_rates/status/674646392044941312/photo/1
1904
     https://twitter.com/dog_rates/status/674632714662858753/photo/1
     https://twitter.com/dog_rates/status/674063288070742018/photo/1
1925
```

```
https://twitter.com/dog_rates/status/672980819271634944/photo/1
      https://twitter.com/dog_rates/status/672231046314901505/photo/1
2013
2026
      https://twitter.com/dog_rates/status/671879137494245376/photo/1
2063
      https://twitter.com/dog_rates/status/671159727754231808/photo/1
      https://twitter.com/dog_rates/status/670782429121134593/photo/1
2092
2109
      https://twitter.com/dog_rates/status/670449342516494336/photo/1
2134
      https://twitter.com/dog_rates/status/670069087419133954/photo/1
2139
      https://twitter.com/dog_rates/status/670037189829525505/photo/1
2153
      https://twitter.com/dog_rates/status/669661792646373376/photo/1
2181
      https://twitter.com/dog_rates/status/668994913074286592/photo/1
2206
      https://twitter.com/dog_rates/status/668631377374486528/photo/1
      https://twitter.com/dog_rates/status/667911425562669056/photo/1
2242
2260
      https://twitter.com/dogratingrating/status/667548415174144001/photo/1,https://twi
      https://twitter.com/dog_rates/status/666776908487630848/photo/1
2312
2351
      https://twitter.com/dog_rates/status/666049248165822465/photo/1
                         rating_denominator
                                                          doggo floofer
                                                                          pupper
      rating_numerator
                                                    name
45
                                               Bella
                                                                  None
                                                                          None
      5
                          10
                                                          None
      5
                          10
                                                                  None
730
                                               None
                                                          None
                                                                          None
      5
                          10
956
                                               None
                                                          doggo
                                                                  None
                                                                           pupper
1399
      5
                          10
                                               Dave
                                                          None
                                                                  None
                                                                          None
1461
      5
                          10
                                               None
                                                          None
                                                                  None
                                                                          None
1508
      5
                          10
                                               None
                                                          None
                                                                  None
                                                                          None
1583
                                               None
                                                                          None
      5
                          10
                                                          None
                                                                  None
1618
      5
                          10
                                               None
                                                          None
                                                                  None
                                                                          None
1619
      5
                          10
                                               Jerry
                                                          None
                                                                  None
                                                                          None
1624
      5
                          10
                                               None
                                                                  None
                                                          None
                                                                          pupper
1645
      5
                          10
                                               Jiminy
                                                          None
                                                                  None
                                                                          None
1680
      5
                          10
                                               None
                                                          None
                                                                  None
                                                                          None
1689
      5
                          10
                                               None
                                                          None
                                                                  None
                                                                          None
1727
                          10
                                               Penelope
                                                                          None
      5
                                                          None
                                                                  None
1796
      5
                          10
                                               Juckson
                                                                  None
                                                                          None
                                                          None
1808
      5
                          10
                                               None
                                                          None
                                                                  None
                                                                          None
                                               Bubbles
1820
      5
                          10
                                                          None
                                                                  None
                                                                          None
                                               None
1861
      5
                          10
                                                          None
                                                                  None
                                                                          None
                                               Steven
1874
      5
                          10
                                                          None
                                                                  None
                                                                          None
1901
      5
                          10
                                               None
                                                          None
                                                                  None
                                                                          None
1904
      5
                          10
                                               None
                                                          None
                                                                  None
                                                                          None
                                               Earl
1925
      5
                          10
                                                          None
                                                                  None
                                                                          None
1979
      5
                          10
                                               None
                                                          None
                                                                  None
                                                                          None
2013
                          10
      5
                                               None
                                                          None
                                                                  None
                                                                          None
2026
      5
                          10
                                               Brad
                                                          None
                                                                  None
                                                                          None
2063
      5
                          10
                                               Anthony
                                                          None
                                                                  None
                                                                          None
2092
      5
                          10
                                               None
                                                          None
                                                                  None
                                                                          None
2109
      5
                          10
                                               None
                                                          None
                                                                  None
                                                                          None
2134
      5
                          10
                                               Randall
                                                          None
                                                                  None
                                                                          None
2139
      5
                          10
                                               None
                                                          None
                                                                  None
                                                                          None
2153
      5
                          10
                                                                          None
                                                          None
                                                                  None
```

1979

2181	5	10	None	None	None	None
2206	5	10	Zeek	None	None	None
2242	5	10	None	None	None	None
2260	5	10	None	None	None	None
2312	5	10	Josep	None	None	None
2351	5	10	None	None	None	None

puppo 45 None None 730 None 956 None 1399 1461 None 1508 None 1583 None 1618 None 1619 None 1624 None 1645 None 1680 None 1689 None 1727 None None 1796 1808 None 1820 None 1861 None 1874 None 1901 None 1904 None 1925 None 1979 None 2013 None 2026 None 2063 None 2092 None 2109 None 2134 None 2139 None 2153 None 2181 None 2206 None 2242 None 2260 None 2312 None

In [24]: archive.timestamp.sort_values()

None

2351

Out[24]: 2355 2015-11-15 22:32:08 +0000

```
2354
        2015-11-15 23:05:30 +0000
        2015-11-15 23:21:54 +0000
2353
2352
        2015-11-16 00:04:52 +0000
2351
        2015-11-16 00:24:50 +0000
2350
        2015-11-16 00:30:50 +0000
        2015-11-16 00:35:11 +0000
2349
2348
        2015-11-16 00:49:46 +0000
2347
        2015-11-16 00:55:59 +0000
        2015-11-16 01:01:59 +0000
2346
2345
        2015-11-16 01:22:45 +0000
        2015-11-16 01:52:02 +0000
2344
        2015-11-16 01:59:36 +0000
2343
2342
        2015-11-16 02:38:37 +0000
2341
        2015-11-16 03:22:39 +0000
2340
        2015-11-16 03:44:34 +0000
2339
        2015-11-16 03:55:04 +0000
2338
        2015-11-16 04:02:55 +0000
2337
        2015-11-16 14:57:41 +0000
        2015-11-16 15:14:19 +0000
2336
2335
        2015-11-16 16:11:11 +0000
2334
        2015-11-16 16:37:02 +0000
2333
        2015-11-16 19:31:45 +0000
2332
        2015-11-16 20:01:42 +0000
2331
        2015-11-16 20:32:58 +0000
2330
        2015-11-16 21:10:36 +0000
        2015-11-16 21:54:18 +0000
2329
2328
        2015-11-16 23:23:41 +0000
2327
        2015-11-17 00:06:54 +0000
2326
        2015-11-17 00:24:19 +0000
29
        2017-07-15 23:25:31 +0000
28
        2017-07-16 20:14:00 +0000
27
        2017-07-16 23:58:41 +0000
26
        2017-07-17 16:17:36 +0000
25
        2017-07-18 00:07:08 +0000
24
        2017-07-18 16:08:03 +0000
23
        2017-07-19 00:47:34 +0000
22
        2017-07-19 03:39:09 +0000
        2017-07-19 16:06:48 +0000
21
20
        2017-07-20 16:49:33 +0000
        2017-07-21 01:02:36 +0000
19
        2017-07-22 00:23:06 +0000
18
17
        2017-07-22 16:56:37 +0000
16
        2017-07-23 00:22:39 +0000
15
        2017-07-24 00:19:32 +0000
14
        2017-07-24 17:02:04 +0000
13
        2017-07-25 00:10:02 +0000
12
        2017-07-25 01:55:32 +0000
```

```
11
                 2017-07-25 16:11:53 +0000
         10
                 2017-07-26 00:31:25 +0000
         9
                 2017-07-26 15:59:51 +0000
         8
                 2017-07-27 16:25:51 +0000
         7
                 2017-07-28 00:22:40 +0000
         6
                 2017-07-28 16:27:12 +0000
         5
                 2017-07-29 00:08:17 +0000
         4
                 2017-07-29 16:00:24 +0000
         3
                 2017-07-30 15:58:51 +0000
         2
                 2017-07-31 00:18:03 +0000
                 2017-08-01 00:17:27 +0000
         1
                 2017-08-01 16:23:56 +0000
         Name: timestamp, Length: 2356, dtype: object
In [25]: archive[archive.duplicated() ==True]
         archive[archive.tweet_id.duplicated() ==True]
Out[25]: Empty DataFrame
         Columns: [tweet_id, in_reply_to_status_id, in_reply_to_user_id, timestamp, source, text
         Index: []
In [26]: archive.source.value_counts()
Out[26]: <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
         <a href="http://vine.co" rel="nofollow">Vine - Make a Scene</a>
         <a href="http://twitter.com" rel="nofollow">Twitter Web Client</a>
         <a href="https://about.twitter.com/products/tweetdeck" rel="nofollow">TweetDeck</a>
         Name: source, dtype: int64
In [27]: sum(archive.expanded_urls.isnull())
Out[27]: 59
In [28]: sum(archive.in_reply_to_user_id.isnull())
Out[28]: 2278
In [29]: sum(archive.retweeted_status_user_id.isnull())
Out[29]: 2175
2.2 imagePrediction table
In [30]: imagePrediction.head()
Out[30]:
                      tweet id
                                                                         jpg_url \
         O 666020888022790149 https://pbs.twimg.com/media/CT4udnOWwAAOaMy.jpg
         1 666029285002620928 https://pbs.twimg.com/media/CT42GRgUYAA5iDo.jpg
         2 666033412701032449 https://pbs.twimg.com/media/CT4521TWwAEvMyu.jpg
         3 666044226329800704 https://pbs.twimg.com/media/CT5Dr8HUEAA-lEu.jpg
```

4 666049248165822465 https://pbs.twimg.com/media/CT5IQmsXIAAKY4A.jpg

```
p1_conf p1_dog
                                                                     p2 \
   img_num
                               p1
0
  1
                                   0.465074
                                             True
           Welsh_springer_spaniel
                                                     collie
1
  1
           redbone
                                   0.506826 True
                                                     miniature_pinscher
2 1
           German_shepherd
                                                     malinois
                                   0.596461 True
           Rhodesian_ridgeback
3 1
                                   0.408143 True
                                                     redbone
           miniature_pinscher
                                   0.560311 True
                                                     Rottweiler
   p2_conf p2_dog
                                     рЗ
                                          p3_conf p3_dog
0 0.156665
            True
                    Shetland_sheepdog
                                         0.061428
                                                   True
1 0.074192
                    Rhodesian_ridgeback
                                         0.072010 True
            True
                    bloodhound
2 0.138584
            True
                                         0.116197
                                                   True
                    miniature_pinscher
3 0.360687
                                         0.222752 True
            True
4 0.243682 True
                    Doberman
                                         0.154629 True
```

In [31]: imagePrediction.info()

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2075 entries, 0 to 2074
Data columns (total 12 columns):
tweet_id
            2075 non-null int64
jpg_url
            2075 non-null object
            2075 non-null int64
img_num
            2075 non-null object
р1
            2075 non-null float64
p1_conf
            2075 non-null bool
p1_dog
р2
            2075 non-null object
            2075 non-null float64
p2_conf
            2075 non-null bool
p2_dog
рЗ
            2075 non-null object
            2075 non-null float64
p3_conf
p3_dog
            2075 non-null bool
dtypes: bool(3), float64(3), int64(2), object(4)
memory usage: 152.1+ KB
```

In [32]: imagePrediction.describe()

Out[32]:		tweet_id	img_num	p1_conf	p2_conf	p3_conf
	count	2.075000e+03	2075.000000	2075.000000	2.075000e+03	2.075000e+03
	mean	7.384514e+17	1.203855	0.594548	1.345886e-01	6.032417e-02
	std	6.785203e+16	0.561875	0.271174	1.006657e-01	5.090593e-02
	min	6.660209e+17	1.000000	0.044333	1.011300e-08	1.740170e-10
	25%	6.764835e+17	1.000000	0.364412	5.388625e-02	1.622240e-02
	50%	7.119988e+17	1.000000	0.588230	1.181810e-01	4.944380e-02
	75%	7.932034e+17	1.000000	0.843855	1.955655e-01	9.180755e-02
	max	8.924206e+17	4.000000	1.000000	4.880140e-01	2.734190e-01

```
In [33]: imagePrediction['p1_conf'].describe().apply(lambda x: format(x, 'f'))
Out[33]: count
                  2075.000000
                  0.594548
         mean
         std
                  0.271174
         min
                  0.044333
         25%
                  0.364412
         50%
                  0.588230
         75%
                  0.843855
                  1.000000
         max
         Name: p1_conf, dtype: object
In [34]: imagePrediction['p2_conf'].describe().apply(lambda x: format(x, 'f'))
Out [34]: count
                  2075.000000
         mean
                  0.134589
         std
                  0.100666
                  0.000000
         min
         25%
                  0.053886
         50%
                  0.118181
         75%
                  0.195566
                  0.488014
         Name: p2_conf, dtype: object
In [35]: imagePrediction['p3_conf'].describe().apply(lambda x: format(x, 'f'))
Out [35]: count
                  2075.000000
         mean
                  0.060324
         std
                  0.050906
                  0.000000
         min
         25%
                  0.016222
         50%
                  0.049444
         75%
                  0.091808
                  0.273419
         Name: p3_conf, dtype: object
In [36]: imagePrediction.p1.value_counts()
Out[36]: golden_retriever
                                       150
         Labrador_retriever
                                       100
         Pembroke
                                       89
         Chihuahua
                                       83
         pug
                                       57
         chow
                                       44
         Samoyed
                                       43
         toy_poodle
                                       39
         Pomeranian
                                       38
         malamute
                                       30
         cocker_spaniel
                                       30
```

French_bulldog	26
miniature_pinscher	23
Chesapeake_Bay_retriever	23
seat_belt	22
Siberian_husky	20
German_shepherd	20
Staffordshire_bullterrier	20
Cardigan	19
web_site	19
beagle	18
Eskimo_dog	18
Shetland_sheepdog	18
Maltese_dog	18
teddy	18
Lakeland_terrier	17
Rottweiler	17
Shih-Tzu	17
kuvasz	16
	16
Italian_greyhound	10
nlatunus	1
platypus four-poster	1
-	1
orange	1
grey_fox	1
tricycle	
leaf_beetle	1
polecat	1
conch	1
stove	1
Japanese_spaniel	1
bison	1
water_bottle	1
leopard	1
mud_turtle	1
maze	1
mortarboard	1
pencil_box	1
pillow	1
nail	1
Madagascar_cat	1
ibex	1
lawn_mower	1
coil	1
swab	1
wild_boar	1
hummingbird	1
studio_couch	1
giant_panda	1

	terrapin 1 envelope 1 Name: p1, Length: 378, dtype:	int64
In [37]:	imagePrediction.p2.value_count	s()
	Labrador_retriever golden_retriever Cardigan Chihuahua Pomeranian Chesapeake_Bay_retriever French_bulldog toy_poodle cocker_spaniel Siberian_husky miniature_poodle beagle Pembroke Eskimo_dog collie kuvasz Italian_greyhound Pekinese American_Staffordshire_terrier chow miniature_pinscher toy_terrier malinois Samoyed	104 92 73 44 42 41 41 37 34 33 28 27 27 27 26 22 21 20 20 20 20 20
	Norwegian_elkhound Boston_bull Staffordshire_bullterrier pug Irish_terrier kelpie bearskin spotlight otter soccer_ball knee_pad snail giant_panda dumbbell waffle_iron tray	19 19 18 17 17 16 1 1 1 1 1 1 1 1 1

can_opener

cowboy_hat			1
Madagascar_cat			1
boathouse			1
television			1
computer_keyboard			1
china_cabinet			1
patio			1
timber_wolf			1
trench_coat			1
coral_reef			1
shower_cap			1
lesser_panda			1
white_wolf			1
rule			1
lighter			1
lawn_mower			1
pelican			1
handkerchief			1
mosquito_net			1
Name: p2, Length:	405,	dtype:	int64

In [38]: imagePrediction.p3.value_counts()

Out[38]:	Labrador_retriever	79
	Chihuahua	58
	golden_retriever	48
	Eskimo_dog	38
	kelpie	35
	kuvasz	34
	Staffordshire_bullterrier	32
	chow	32
	cocker_spaniel	31
	beagle	31
	toy_poodle	29
	Pekinese	29
	Pomeranian	29
	Pembroke	27
	Chesapeake_Bay_retriever	27
	Great_Pyrenees	27
	malamute	26
	French_bulldog	26
	American_Staffordshire_terrier	24
	Cardigan	23
	pug	23
	basenji	21
	bull_mastiff	20
	toy_terrier	20
	Siberian_husky	19

```
Boston_bull
                                             17
         Shetland_sheepdog
                                             17
         Lakeland_terrier
                                             16
         boxer
                                             16
         doormat
                                             16
                                             . .
         chickadee
                                             1
         moped
                                             1
         quill
                                             1
         bullfrog
                                             1
         gorilla
                                             1
         golfcart
                                             1
                                             1
         toyshop
                                             1
         pot
         notebook
                                             1
         wallet
                                             1
         barbell
                                             1
         wombat
                                             1
         pool_table
                                             1
         green_lizard
                                             1
         Band_Aid
                                             1
         screen
                                             1
         cliff
                                             1
         French_horn
                                             1
         red_wolf
                                             1
         chest
                                             1
                                             1
         wing
         guillotine
                                             1
         power_drill
                                             1
         joystick
                                             1
         sea_cucumber
                                             1
         maze
                                             1
                                             1
         cup
         crossword_puzzle
                                             1
         pickup
                                             1
         vacuum
         Name: p3, Length: 408, dtype: int64
In [39]: imagePrediction.p1_dog.value_counts()
Out[39]: True
                  1532
                  543
         False
         Name: p1_dog, dtype: int64
In [40]: imagePrediction.p2_dog.value_counts()
Out[40]: True
                  1553
         False
                  522
         Name: p2_dog, dtype: int64
```

```
In [41]: imagePrediction.p3_dog.value_counts()
Out[41]: True
                  1499
         False
                  576
         Name: p3_dog, dtype: int64
2.3 imagePrediction table
In [42]: tweet_json.head()
Out[42]:
                       tweet_id retweet_count favorite_count
         0 1090301319825436672 2
                                                305
         1 1090300780270149632 11
                                                1226
         2 1090300624657252352 6989
                                                79691
         3 1090060665903927296 1
                                                143
         4 1090060504788197377 1
                                                116
In [43]: tweet_json.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2157 entries, 0 to 2156
Data columns (total 3 columns):
tweet_id
                  2157 non-null int64
retweet_count
                  2157 non-null int64
favorite_count
                  2157 non-null int64
dtypes: int64(3)
memory usage: 50.6 KB
In [44]: tweet_json.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2157 entries, 0 to 2156
Data columns (total 3 columns):
tweet_id
                  2157 non-null int64
                  2157 non-null int64
retweet_count
favorite_count
                  2157 non-null int64
dtypes: int64(3)
memory usage: 50.6 KB
In [45]: tweet_json.describe()
Out[45]:
                    tweet_id retweet_count
                                             favorite_count
                2.157000e+03 2157.000000
                                             2157.000000
         count
                1.043777e+18 2811.560037
                                             10408.850255
         mean
                1.998247e+16 19050.964888
                                             40845.247559
         std
         min
                1.027963e+18 0.000000
                                             0.000000
         25%
                1.028138e+18 0.000000
                                             0.000000
         50%
                1.029407e+18 0.000000
                                             1.000000
         75%
                1.060962e+18 4.000000
                                             357.000000
```

1.090301e+18 466025.000000 690028.000000

max

2.4 Merge the table names a

4 Clean

4.0.1 1. Tidiness

copy all data frames before making any cleaning process using copy() function to save them in case you need to return back with the original

Tidiness

doggo, floofer, pupper, and puppo column in archive table are all describing dog age stage.

Define The doggo, floofer, pupper, and puppo column should be merged into one column called dog_stage to reduce redundency.

Code

```
Out[50]:
                           1976
         pupper
                           245
         doggo
                          83
                           29
         puppo
         doggopupper
                           12
         floofer
                           9
         doggopuppo
                           1
         doggofloofer
                          1
         Name: dog_stage, dtype: int64
```

There are 1 doggo and puppo value and 1 doggo and floofer value, and 12 doggo pupper value. This may happen when text has both word. I will need to check these rows one by one to verify if it is right.

```
In [51]: Archive_clean[Archive_clean['dog_stage'] == 'doggopuppo'] #It's clearly a puppo
Out [51]:
                        tweet_id in_reply_to_status_id in_reply_to_user_id \
         191 855851453814013952 NaN
                              timestamp \
             2017-04-22 18:31:02 +0000
         191
                                                                                          source
             <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
         191 Here's a puppo participating in the #ScienceMarch. Cleverly disguising her own dog
              retweeted_status_id retweeted_status_user_id retweeted_status_timestamp \
         191 NaN
                                  NaN
                                                             NaN
                                                                expanded_urls \
            https://twitter.com/dog_rates/status/855851453814013952/photo/1
              rating_numerator rating_denominator name
                                                          dog_stage
         191
             13
                                                    NaN doggopuppo
In [52]: Archive_clean.loc[Archive_clean['dog_stage'] == 'doggopuppo', 'dog_stage'] = 'puppo'
In [53]: Archive_clean[Archive_clean['dog_stage'] == 'doggofloofer'] #this should be a floofer
Out [53]:
                        tweet_id in_reply_to_status_id in_reply_to_user_id \
         200 854010172552949760 NaN
                                                        NaN
                              timestamp \
             2017-04-17 16:34:26 +0000
         200
              <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
         200
             At first I thought this was a shy doggo, but it's actually a Rare Canadian Floofer
              retweeted_status_id retweeted_status_user_id retweeted_status_timestamp \
         200 NaN
                                  NaN
                                                             NaN
         200 https://twitter.com/dog_rates/status/854010172552949760/photo/1,https://twitter.co
```

```
rating_numerator rating_denominator name
                                                             dog_stage
         200 11
                                                    NaN doggofloofer
In [54]: Archive_clean.loc[Archive_clean['dog_stage'] == 'doggofloofer','dog_stage'] = 'floofer
In [55]: Archive_clean[Archive_clean['dog_stage'] == 'doggopupper']
         #Some tweets have both doggo and pupper for two dogs, this will be kept and used as one
Out [55]:
                         tweet_id in_reply_to_status_id in_reply_to_user_id \
         460
               817777686764523521 NaN
                                                         NaN
         531
               808106460588765185 NaN
                                                         NaN
         565
               802265048156610565 7.331095e+17
                                                          4.196984e+09
         575
               801115127852503040 NaN
                                                         NaN
         705
                                                         NaN
               785639753186217984 NaN
                                                         NaN
         733
               781308096455073793 NaN
         778
               775898661951791106 NaN
                                                         NaN
         822
               770093767776997377 NaN
                                                         NaN
         889
                                                         NaN
               759793422261743616 NaN
         956
                                                         NaN
               751583847268179968 NaN
                                                         NaN
         1063 741067306818797568 NaN
         1113 733109485275860992 NaN
                                                         NaN
                               timestamp \
         460
               2017-01-07 16:59:28 +0000
         531
               2016-12-12 00:29:28 +0000
         565
               2016-11-25 21:37:47 +0000
         575
               2016-11-22 17:28:25 +0000
         705
               2016-10-11 00:34:48 +0000
         733
               2016-09-29 01:42:20 +0000
               2016-09-14 03:27:11 +0000
         778
         822
               2016-08-29 03:00:36 +0000
         889
               2016-07-31 16:50:42 +0000
         956
               2016-07-09 01:08:47 +0000
         1063 2016-06-10 00:39:48 +0000
         1113 2016-05-19 01:38:16 +0000
                                                                                            sourc
         460
               <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
         531
               <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
         565
               <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
               <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
         575
               <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
         705
               <a href="http://vine.co" rel="nofollow">Vine - Make a Scene</a>
         733
         778
               <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
         822
               <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
         889
               <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
               <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
         956
```

Twitter for iPhone</a

1063

```
<a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a</pre>
1113
460
      This is Dido. She's playing the lead role in "Pupper Stops to Catch Snow Before F
      Here we have Burke (pupper) and Dexter (doggo). Pupper wants to be exactly like of
531
      Like doggo, like pupper version 2. Both 11/10 https://t.co/9IxWAXFqze
565
575
      This is Bones. He's being haunted by another doggo of roughly the same size. 12/1
705
      This is Pinot. He's a sophisticated doggo. You can tell by the hat. Also pointier
      Pupper butt 1, Doggo O. Both 12/10 https://t.co/WQvcPEpH2u
733
778
      RT @dog_rates: Like father (doggo), like son (pupper). Both 12/10 https://t.co/p@
      RT @dog_rates: This is just downright precious af. 12/10 for both pupper and dogg
822
      Meet Maggie & Lila. Maggie is the doggo, Lila is the pupper. They are sisters
889
      Please stop sending it pictures that don't even have a doggo or pupper in them. O
956
1063 This is just downright precious af. 12/10 for both pupper and doggo https://t.co/
1113 Like father (doggo), like son (pupper). Both 12/10 https://t.co/pG2inLaOda
      retweeted_status_id retweeted_status_user_id \
460 NaN
                           NaN
                           NaN
531
    {\tt NaN}
565
    NaN
                           NaN
575
    {\tt NaN}
                           NaN
705 NaN
                           NaN
733 NaN
778
     7.331095e+17
                           4.196984e+09
822
     7.410673e+17
                           4.196984e+09
889 NaN
                           NaN
                           NaN
956 NaN
1063 NaN
                           NaN
1113 NaN
                           NaN
     retweeted_status_timestamp \
460
      NaN
531
      NaN
565
      NaN
575
      NaN
705
      NaN
733
778
      2016-05-19 01:38:16 +0000
      2016-06-10 00:39:48 +0000
822
889
      NaN
956
      NaN
1063
     {\tt NaN}
1113
     {\tt NaN}
460
      https://twitter.com/dog_rates/status/817777686764523521/video/1
531
      https://twitter.com/dog_rates/status/808106460588765185/photo/1
565
      https://twitter.com/dog_rates/status/802265048156610565/photo/1
```

```
575
                                                                                                                         https://twitter.com/dog_rates/status/801115127852503040/photo/1,https://twitter.c
                                                                                                                         https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/785639753186217984/photo/1,https://twitter.com/dog_rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/sta
                                                                          705
                                                                          733
                                                                                                                         https://vine.co/v/5rgu2Law2ut
                                                                          778
                                                                                                                         https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/733109485275860992/photo/1,https://twitter.com/dog_rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/sta
                                                                                                                         https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/741067306818797568/photo/1,https://twitter.com/dog_rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/sta
                                                                          822
                                                                          889
                                                                                                                         https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/759793422261743616/photo/1,https://twitter.com/dog_rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/status/rates/sta
                                                                          956
                                                                                                                         https://twitter.com/dog_rates/status/751583847268179968/photo/1
                                                                          1063
                                                                                                                         https://twitter.com/dog_rates/status/741067306818797568/photo/1
                                                                                                                         https://twitter.com/dog_rates/status/733109485275860992/photo/1
                                                                          1113
                                                                                                                         rating_numerator
                                                                                                                                                                                                                                                                            rating_denominator
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   dog_stage
                                                                                                                                                                                                                                                                                                                                                                                                                                                                 name
                                                                          460
                                                                                                                         13
                                                                                                                                                                                                                                                                             10
                                                                                                                                                                                                                                                                                                                                                                                                                                                  Dido
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   doggopupper
                                                                          531
                                                                                                                         12
                                                                                                                                                                                                                                                                             10
                                                                                                                                                                                                                                                                                                                                                                                                                                                  NaN
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    doggopupper
                                                                          565
                                                                                                                         11
                                                                                                                                                                                                                                                                             10
                                                                                                                                                                                                                                                                                                                                                                                                                                                  NaN
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    doggopupper
                                                                          575
                                                                                                                         12
                                                                                                                                                                                                                                                                             10
                                                                                                                                                                                                                                                                                                                                                                                                                                                 Bones
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   doggopupper
                                                                          705
                                                                                                                                                                                                                                                                             10
                                                                                                                         10
                                                                                                                                                                                                                                                                                                                                                                                                                                                 Pinot
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   doggopupper
                                                                          733
                                                                                                                         12
                                                                                                                                                                                                                                                                             10
                                                                                                                                                                                                                                                                                                                                                                                                                                                 NaN
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   doggopupper
                                                                          778
                                                                                                                         12
                                                                                                                                                                                                                                                                             10
                                                                                                                                                                                                                                                                                                                                                                                                                                                  NaN
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   doggopupper
                                                                                                                         12
                                                                          822
                                                                                                                                                                                                                                                                             10
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   doggopupper
                                                                                                                                                                                                                                                                                                                                                                                                                                                  just
                                                                          889
                                                                                                                          12
                                                                                                                                                                                                                                                                             10
                                                                                                                                                                                                                                                                                                                                                                                                                                                 Maggie
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                  doggopupper
                                                                          956
                                                                                                                          5
                                                                                                                                                                                                                                                                             10
                                                                                                                                                                                                                                                                                                                                                                                                                                                  {\tt NaN}
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    doggopupper
                                                                          1063
                                                                                                                      12
                                                                                                                                                                                                                                                                             10
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   doggopupper
                                                                                                                                                                                                                                                                                                                                                                                                                                                  just
                                                                          1113
                                                                                                                     12
                                                                                                                                                                                                                                                                             10
                                                                                                                                                                                                                                                                                                                                                                                                                                                  NaN
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   doggopupper
In [56]: Archive_clean['dog_stage'].value_counts()
Out [56]:
                                                                                                                                                                                                      1976
                                                                                                                                                                                                    245
                                                                        pupper
                                                                          doggo
                                                                                                                                                                                                   83
                                                                          puppo
                                                                                                                                                                                                    30
                                                                                                                                                                                                      12
                                                                          doggopupper
```

The result looks correct. Let's work on the second tidy data issue - The column names in imagePrediction are not specific and not easy to undstand. ### Define

Rename column names -(p1,p1_conf,p1_dog,p2,p2_conf,p2_dog,p3,p3_conf,p3_dog) in imagePrediction to make them user friendly

4.0.2 Code

floofer

10 Name: dog_stage, dtype: int64

```
In [57]: imagePrediction_clean.rename(index=str, columns={"p1":"prediction1", "p1_conf":"prediction1", "p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1_conf":"p1
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                               "p2" : "prediction2", "p2_conf": "predict
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       "p3" : "prediction3", "p3_conf": "prediction3"
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       "img_num" : "most_confident_img_num"},
```

4.0.3 Test

```
In [58]: imagePrediction_clean.head(2)
```

```
Out[58]:
                     tweet_id
                                                                      jpg_url \
        0 666020888022790149 https://pbs.twimg.com/media/CT4udn0WwAA0aMy.jpg
        1 666029285002620928 https://pbs.twimg.com/media/CT42GRgUYAA5iDo.jpg
                                              prediction1 prediction_confidence1 \
           most_confident_img_num
                                   Welsh_springer_spaniel 0.465074
        1 1
                                   redbone
                                                           0.506826
           dogbreed_indicator1
                                       prediction2 prediction_confidence2 \
                                                   0.156665
        0 True
                                collie
        1 True
                                miniature_pinscher 0.074192
           dogbreed_indicator2
                                        prediction3 prediction_confidence3 \
        0 True
                                Shetland_sheepdog
                                                    0.061428
        1 True
                                Rhodesian_ridgeback 0.072010
           dogbreed_indicator3
        0 True
        1 True
```

The columns name in imagePrediction table is changed and look make sense.

4.0.4 Define

The last step should be merging tweets_json table with Twitter_Archive Table on tweet_id column.

4.0.5 Code

Here, I will keep Archive_clean table and image prediction table both for tidiness of data.

4.0.6 Test

```
In [60]: Archive_clean.head()
Out[60]:
                     tweet_id in_reply_to_status_id in_reply_to_user_id \
        0 892420643555336193 NaN
                                                     NaN
        1 892177421306343426 NaN
                                                     NaN
        2 891815181378084864 NaN
                                                     NaN
        3 891689557279858688 NaN
                                                     NaN
        4 891327558926688256 NaN
                                                     NaN
                           timestamp \
        0 2017-08-01 16:23:56 +0000
        1 2017-08-01 00:17:27 +0000
        2 2017-07-31 00:18:03 +0000
        3 2017-07-30 15:58:51 +0000
```

4 2017-07-29 16:00:24 +0000

```
source
 <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
  <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
  <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
3 <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
  <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
 This is Phineas. He's a mystical boy. Only ever appears in the hole of a donut. 13/1
1 This is Tilly. She's just checking pup on you. Hopes you're doing ok. If not, she's
2 This is Archie. He is a rare Norwegian Pouncing Corgo. Lives in the tall grass. You
3 This is Darla. She commenced a snooze mid meal. 13/10 happens to the best of us http
4 This is Franklin. He would like you to stop calling him "cute." He is a very fierce
   retweeted_status_id retweeted_status_user_id retweeted_status_timestamp \
0 NaN
                       NaN
                                                  NaN
1 NaN
                       NaN
                                                  NaN
2 NaN
                       {\tt NaN}
                                                  NaN
3 NaN
                       NaN
                                                  NaN
4 NaN
                       NaN
                                                  NaN
0 https://twitter.com/dog_rates/status/892420643555336193/photo/1
1 https://twitter.com/dog_rates/status/892177421306343426/photo/1
2 https://twitter.com/dog_rates/status/891815181378084864/photo/1
3 https://twitter.com/dog_rates/status/891689557279858688/photo/1
4 https://twitter.com/dog_rates/status/891327558926688256/photo/1,https://twitter.com/
   rating_numerator rating_denominator
                                             name dog_stage retweet_count \
0
  13
                     10
                                         Phineas
                                                            NaN
1
  13
                     10
                                         Tilly
                                                            NaN
2
  12
                                         Archie
                     10
                                                            NaN
  13
                                         Darla
                                                            NaN
3
                     10
  12
                     10
                                         Franklin
                                                            NaN
   favorite_count
0 NaN
1 NaN
2 NaN
3 NaN
4 NaN
```

Here, I will keep Archive_clean table and image prediction table both for tidiness of data.

5 Quality issues

Missing data is part of data quality issue.

5.0.1 Define

expanded_urls column has 59 url with missing value, I can fill them up by combining 'https://twitter.com/dog_rates/status/' with their tweet id and connect to '/photo/1'

5.0.2 Test

```
In [67]: sum(Archive_clean['expanded_urls'].isnull())
Out[67]: 0
```

From the result, we can see all the missing value in expanded_urls column is filled with correct url

in_reply_to_status_id,in_reply_to_user_id all only have 78 non-null value, 2278 missing value, 97% field in these columns are missing. retweeted_status_id,retweeted_status_user_id and retweeted_status_timestamp have 2175 missing value out of 2356, about 92% fields are missing.

6 Define

Since we don't use reweet data, I will delete the rows populated with values under these columns and remove these columns which have a large amount of missing value.

7 Code

```
In [63]: Archive_clean[Archive_clean["in_reply_to_status_id"].isnull() ==False]
Out[63]:
                         tweet_id in_reply_to_status_id in_reply_to_user_id \
         30
               886267009285017600 8.862664e+17
                                                          2.281182e+09
         55
               881633300179243008 8.816070e+17
                                                          4.738443e+07
               879674319642796034 8.795538e+17
                                                          3.105441e+09
         113
               870726314365509632 8.707262e+17
                                                          1.648776e+07
         148
               863427515083354112 8.634256e+17
                                                          7.759620e+07
         149
               863079547188785154 6.671522e+17
                                                          4.196984e+09
         179
               857214891891077121 8.571567e+17
                                                          1.806710e+08
         184
               856526610513747968 8.558181e+17
                                                          4.196984e+09
         186
               856288084350160898 8.562860e+17
                                                          2.792810e+08
         188
               855862651834028034 8.558616e+17
                                                          1.943518e+08
         189
              855860136149123072 8.558585e+17
                                                          1.361572e+07
         218
               850333567704068097 8.503288e+17
                                                          2.195506e+07
         228
              848213670039564288 8.482121e+17
                                                          4.196984e+09
         234
              847617282490613760 8.476062e+17
                                                          4.196984e+09
```

```
251
      844979544864018432
                          7.590995e+17
                                                   4.196984e+09
274
      840698636975636481
                           8.406983e+17
                                                   8.405479e+17
290
      838150277551247360
                                                   2.195506e+07
                           8.381455e+17
291
      838085839343206401
                           8.380855e+17
                                                   2.894131e+09
313
      835246439529840640
                           8.352460e+17
                                                   2.625958e+07
342
      832088576586297345
                           8.320875e+17
                                                   3.058208e+07
346
      831926988323639298
                           8.319030e+17
                                                   2.068372e+07
387
      826598799820865537
                           8.265984e+17
                                                   4.196984e+09
409
      823333489516937216
                           8.233264e+17
                                                   1.582854e+09
427
      821153421864615936
                           8.211526e+17
                                                   1.132119e+08
498
      813130366689148928
                           8.131273e+17
                                                   4.196984e+09
513
      811647686436880384
                           8.116272e+17
                                                   4.196984e+09
565
      802265048156610565
                           7.331095e+17
                                                   4.196984e+09
570
      801854953262350336
                           8.018543e+17
                                                   1.185634e+07
576
      800859414831898624
                           8.008580e+17
                                                   2.918590e+08
611
      797165961484890113
                           7.971238e+17
                                                   2.916630e+07
1479
      693582294167244802
                           6.935722e+17
                                                   1.198989e+09
1497
      692423280028966913
                           6.924173e+17
                                                   4.196984e+09
1501
      692142790915014657
                           6.920419e+17
                                                   4.196984e+09
1523
      690607260360429569
                           6.903413e+17
                                                   4.670367e+08
1598
      686035780142297088
                           6.860340e+17
                                                   4.196984e+09
1605
      685681090388975616
                           6.855479e+17
                                                   4.196984e+09
1618
      684969860808454144
                           6.849598e+17
                                                   4.196984e+09
                                                   4.196984e+09
1630
      684538444857667585
                           6.844811e+17
                           6.842229e+17
      684225744407494656
                                                   4.196984e+09
1634
1663
      682808988178739200
                           6.827884e+17
                                                   4.196984e+09
1689
      681340665377193984
                           6.813394e+17
                                                   4.196984e+09
1774
      678023323247357953
                           6.780211e+17
                                                   4.196984e+09
      676590572941893632
                           6.765883e+17
                                                   4.196984e+09
1819
1842
      675870721063669760
                           6.757073e+17
                                                   4.196984e+09
1844
      675849018447167488
                           6.758457e+17
                                                   4.196984e+09
1852
      675707330206547968
                           6.754971e+17
                                                   4.196984e+09
1866
      675349384339542016
                           6.749998e+17
                                                   4.196984e+09
1882
                                                   4.196984e+09
      674999807681908736
                           6.747934e+17
1885
      674793399141146624
                           6.717299e+17
                                                   4.196984e+09
1892
      674754018082705410
                           6.747522e+17
                                                   4.196984e+09
1895
      674742531037511680
                           6.747400e+17
                                                   4.196984e+09
1905
      674606911342424069
                           6.744689e+17
                                                   4.196984e+09
      674330906434379776
                           6.658147e+17
                                                   1.637468e+07
1914
1940
      673716320723169284
                           6.737159e+17
                                                   4.196984e+09
2036
      671729906628341761
                           6.715610e+17
                                                   4.196984e+09
2038
      671550332464455680
                           6.715449e+17
                                                   4.196984e+09
2149
      669684865554620416
                           6.693544e+17
                                                   4.196984e+09
2169
      669353438988365824
                           6.678065e+17
                                                   4.196984e+09
2189
      668967877119254528
                           6.689207e+17
                                                   2.143566e+07
2298
      667070482143944705
                           6.670655e+17
                                                   4.196984e+09
```

```
timestamp
30
      2017-07-15 16:51:35 +0000
55
      2017-07-02 21:58:53 +0000
64
      2017-06-27 12:14:36 +0000
      2017-06-02 19:38:25 +0000
113
      2017-05-13 16:15:35 +0000
148
149
      2017-05-12 17:12:53 +0000
179
      2017-04-26 12:48:51 +0000
      2017-04-24 15:13:52 +0000
184
186
      2017-04-23 23:26:03 +0000
      2017-04-22 19:15:32 +0000
188
      2017-04-22 19:05:32 +0000
189
      2017-04-07 13:04:55 +0000
218
      2017-04-01 16:41:12 +0000
228
234
      2017-03-31 01:11:22 +0000
251
      2017-03-23 18:29:57 +0000
274
      2017-03-11 22:59:09 +0000
290
      2017-03-04 22:12:52 +0000
291
      2017-03-04 17:56:49 +0000
313
      2017-02-24 21:54:03 +0000
      2017-02-16 04:45:50 +0000
342
      2017-02-15 18:03:45 +0000
346
387
      2017-02-01 01:11:25 +0000
      2017-01-23 00:56:15 +0000
409
427
      2017-01-17 00:33:26 +0000
      2016-12-25 21:12:41 +0000
498
513
      2016-12-21 19:01:02 +0000
565
      2016-11-25 21:37:47 +0000
      2016-11-24 18:28:13 +0000
570
576
      2016-11-22 00:32:18 +0000
      2016-11-11 19:55:50 +0000
611
     2016-01-30 23:51:19 +0000
1479
1497
      2016-01-27 19:05:49 +0000
      2016-01-27 00:31:15 +0000
1501
1523
      2016-01-22 18:49:36 +0000
1598
      2016-01-10 04:04:10 +0000
1605
      2016-01-09 04:34:45 +0000
      2016-01-07 05:28:35 +0000
1618
      2016-01-06 00:54:18 +0000
1630
1634
     2016-01-05 04:11:44 +0000
      2016-01-01 06:22:03 +0000
1663
1689
      2015-12-28 05:07:27 +0000
      2015-12-19 01:25:31 +0000
1774
1819
      2015-12-15 02:32:17 +0000
1842 2015-12-13 02:51:51 +0000
1844
      2015-12-13 01:25:37 +0000
1852 2015-12-12 16:02:36 +0000
```

```
1885 2015-12-10 03:30:58 +0000
1892 2015-12-10 00:54:28 +0000
1895 2015-12-10 00:08:50 +0000
1905 2015-12-09 15:09:55 +0000
1914 2015-12-08 20:53:11 +0000
1940 2015-12-07 04:11:02 +0000
2036 2015-12-01 16:37:44 +0000
2038 2015-12-01 04:44:10 +0000
2149 2015-11-26 01:11:28 +0000
2169 2015-11-25 03:14:30 +0000
2189 2015-11-24 01:42:25 +0000
2298 2015-11-18 20:02:51 +0000
                                                                                    sourc
30
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
55
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
64
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
113
148
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
149
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
179
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
184
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
186
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
188
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
189
218
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
228
234
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
251
274
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
290
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
291
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
313
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a</pre>
342
346
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
387
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
409
427
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
498
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a</pre>
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
513
565
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
570
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
576
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a</pre>
611
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
. . .
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
1479
```

1866 2015-12-11 16:20:15 +0000 1882 2015-12-10 17:11:09 +0000

```
<a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1497
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1501
1523
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1598
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1605
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1618
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1634
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a</pre>
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1663
1689
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
1774
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1819
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1842
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1852
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a>
1866
1882
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1885
1892
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1895
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone/a
1905
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
1914
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a</pre>
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
2036
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
2038
2149
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
2169
2189
      <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone</a
     <a href="http://twitter.com/download/iphone" rel="nofollow">Twitter for iPhone/a
2298
30
      @NonWhiteHat @MayhewMayhem omg hello tanner you are a scary good boy 12/10 would
55
     @roushfenway These are good dogs but 17/10 is an emotional impulse rating. More 1
64
      @RealKentMurphy 14/10 confirmed
113
      @ComplicitOwl @ShopWeRateDogs >10/10 is reserved for dogs
```

- 148 @Jack_Septic_Eye I'd need a few more pics to polish a full analysis, but based on
- 149 Ladies and gentlemen... I found Pipsy. He may have changed his name to Pablo, but
- 179 @Marc_IRL pixelated af 12/10
- THIS IS CHARLIE, MARK. HE DID JUST WANT TO SAY HI AFTER ALL. PUPGRADED TO A 14/10
- 186 @xianmcguire @Jenna_Marbles Kardashians wouldn't be famous if as a society we did
- 188 Odhmontgomery We also gave snoop dogg a 420/10 but I think that predated your res
- 189 @s8n You tried very hard to portray this good boy as not so good, but you have ul
- 218 @markhoppus MARK THAT DOG HAS SEEN AND EXPERIENCED MANY THINGS. PROBABLY LOST OTH
- 228 Jerry just apuppologized to me. He said there was no ill-intent to the slippage.
- 234 . @breaannanicolee PUPDATE: Cannon has a heart on his nose. Pupgraded to a 13/10
- PUPDATE: I'm proud to announce that Toby is 236 days sober. Pupgraded to a 13/10.
- 274 @O_kelvin_O >10/10 is reserved for puppos sorry Kevin
- 290 @markhoppus 182/10

```
291
      @bragg6of8 @Andy_Pace_ we are still looking for the first 15/10
313
      @jonnysun @Lin_Manuel ok jomny I know you're excited but 960/00 isn't a valid rat
342
      Odocmisterio account started on 11/15/15
346
      QUNC can confirm 12/10
387
      I was going to do 007/10, but the joke wasn't worth the <10 rating
409
      @HistoryInPics 13/10
427
      @imgur for a polar bear tho I'd say 13/10 is appropriate
498
      I've been informed by multiple sources that this is actually a dog elf who's tire
513
      PUPDATE: I've been informed that Augie was actually bringing his family these flo
565
      Like doggo, like pupper version 2. Both 11/10 https://t.co/9IxWAXFqze
570
      .@NBCSports OMG THE TINY HAT I'M GOING TO HAVE TO SAY 11/10 NBC
576
      @SkyWilliams doggo simply protecting you from evil that which you cannot see. 11/
611
      @JODYHiGHROLLER it may be an 11/10 but what do I know
1479 Personally I'd give him an 11/10. Not sure why you think you're qualified to rate
1497 PUPDATE: just noticed this dog has some extra legs. Very advanced. Revolutionary
1501 These are some pictures of Teddy that further justify his 13/10 rating. Please er
1523 12/10 @LightningHoltt
1598 Yes I do realize a rating of 4/20 would've been fitting. However, it would be unj
     Jack deserves another round of applause. If you missed this earlier today I stron
1605
1618 For those who claim this is a goat, u are wrong. It is not the Greatest Of All Ti
1630 After watching this video, we've determined that Pippa will be upgraded to a 12/1
1634 Two sneaky puppers were not initially seen, moving the rating to 143/130. Please
1663 I'm aware that I could've said 20/16, but here at WeRateDogs we are very professi
1689 I've been told there's a slight possibility he's checking his mirror. We'll bump
1774 After getting lost in Reese's eyes for several minutes we're going to upgrade him
1819 After some outrage from the crowd. Bubbles is being upgraded to a 7/10. That's as
1842 & amp; this is Yoshi. Another world record contender 11/10 (what the hell is happe
1844
     This dog is being demoted to a 9/10 for not wearing a helmet while riding. Gotta
1852 We've got ourselves a battle here. Watch out Reggie. 11/10 https://t.co/ALJvbtcwf
1866
     Yea I lied. Here's more. All 13/10 https://t.co/ZQZf2U4xCP
1882 Ok last one of these. I may try to make some myself. Anyway here ya go. 13/10 htt
1885 I have found another. 13/10 https://t.co/HwroPYv8pY
1892 Just received another perfect photo of dogs and the sunset. 12/10 https://t.co/99
1895 Some clarification is required. The dog is singing Cher and that is more than wor
1905 The 13/10 also takes into account this impeccable yard. Louis is great but the fu
1914 13/10\n@ABC7
1940 The millennials have spoken and we've decided to immediately demote to a 1/10. The
2036 I'm just going to leave this one here as well. 13/10 https://t.co/DaD5SyajWt
2038 After 22 minutes of careful deliberation this dog is being demoted to a 1/10. The
2149 After countless hours of research and hundreds of formula alterations we have cor
2169 This is Tessa. She is also very pleased after finally meeting her biological fath
2189 12/10 good shit Bubka\n@wane15
2298 After much debate this dog is being upgraded to 10/10. I repeat 10/10
      retweeted_status_id retweeted_status_user_id \
30
     NaN
                          NaN
```

NaN

55

NaN

64	NaN	N	[a]
113	${\tt NaN}$	N	IaN
148	NaN	N	laN
149	NaN	N	IaN
179	NaN	N	laN
184			laN
186			laN
188			IaN
189			IaN
218	NaN		laN
228			[a]
234			laN
251			laN
274			laN
290			IaN
291			laN
313			IaN
342			laN
346			laN
387			[a]
409			[a]
427			[a]
498			[a]
513			IaN
565	NaN		laN
570			laN
576			laN
611			laN
1479			laN
1497	NaN	N	IaN
1501	NaN	N	IaN
1523	NaN	N	laN
1598	NaN	N	IaN
1605	NaN		laN
1618	NaN	N	IaN
1630	NaN	N	IaN
1634	NaN	N	laN
1663	NaN	N	IaN
1689	NaN	N	IaN
1774	NaN	N	laN
1819		N	IaN
1842			IaN
1844			laN
1852			laN
	NaN	N	laN
1882			laN
1885			[a]

```
1892 NaN
                                     NaN
1895 NaN
                                     {\tt NaN}
1905 NaN
                                     NaN
1914 NaN
                                     {\tt NaN}
1940 NaN
                                     {\tt NaN}
2036 NaN
                                     NaN
2038 NaN
                                     NaN
2149 NaN
                                     NaN
2169 NaN
                                     {\tt NaN}
2189 NaN
                                     {\tt NaN}
2298 NaN
                                     NaN
       retweeted_status_timestamp \
30
        NaN
55
        NaN
64
        NaN
113
        {\tt NaN}
148
        NaN
        {\tt NaN}
149
179
        {\tt NaN}
184
        NaN
186
        {\tt NaN}
188
        NaN
189
        {\tt NaN}
218
        {\tt NaN}
228
        {\tt NaN}
234
        {\tt NaN}
251
        NaN
274
        NaN
290
        {\tt NaN}
291
        {\tt NaN}
313
        {\tt NaN}
342
        NaN
346
        NaN
387
        NaN
        {\tt NaN}
409
427
        {\tt NaN}
498
        NaN
513
        NaN
565
        NaN
570
        {\tt NaN}
576
        NaN
611
        {\tt NaN}
. . .
        . . .
1479
        {\tt NaN}
1497
        NaN
1501
        {\tt NaN}
1523
        {\tt NaN}
```

```
1598
      NaN
1605
      {\tt NaN}
1618
      NaN
1630
      {\tt NaN}
1634
      {\tt NaN}
1663
      NaN
1689
      NaN
1774
      {\tt NaN}
1819
      {\tt NaN}
1842
      NaN
1844
      {\tt NaN}
1852
      {\tt NaN}
1866
      {\tt NaN}
1882
      NaN
1885
      {\tt NaN}
1892
      NaN
1895
      NaN
1905
      {\tt NaN}
1914
      NaN
1940
      {\tt NaN}
2036
      NaN
2038
      {\tt NaN}
2149
      {\tt NaN}
2169
      NaN
2189
      NaN
2298
      NaN
30
      https://twitter.com/dog_rates/status/886267009285017600/photo/1
55
      https://twitter.com/dog_rates/status/881633300179243008/photo/1
64
      https://twitter.com/dog_rates/status/879674319642796034/photo/1
113
      https://twitter.com/dog_rates/status/870726314365509632/photo/1
148
      https://twitter.com/dog_rates/status/863427515083354112/photo/1
149
      https://twitter.com/dog_rates/status/863079547188785154/photo/1
179
      https://twitter.com/dog_rates/status/857214891891077121/photo/1
      https://twitter.com/dog_rates/status/856526610513747968/photo/1
184
      https://twitter.com/dog_rates/status/856288084350160898/photo/1
186
      https://twitter.com/dog_rates/status/855862651834028034/photo/1
188
      https://twitter.com/dog_rates/status/855860136149123072/photo/1
189
      https://twitter.com/dog_rates/status/850333567704068097/photo/1
218
228
      https://twitter.com/dog_rates/status/848213670039564288/photo/1
      https://twitter.com/dog_rates/status/847617282490613760/photo/1
234
251
      https://twitter.com/dog_rates/status/844979544864018432/photo/1,https://twitter.c
274
      https://twitter.com/dog_rates/status/840698636975636481/photo/1
      https://twitter.com/dog_rates/status/838150277551247360/photo/1
290
291
      https://twitter.com/dog_rates/status/838085839343206401/photo/1
313
      https://twitter.com/dog_rates/status/835246439529840640/photo/1
342
      https://twitter.com/dog_rates/status/832088576586297345/photo/1
```

```
https://twitter.com/dog_rates/status/831926988323639298/photo/1
346
387
         https://twitter.com/dog_rates/status/826598799820865537/photo/1
409
         https://twitter.com/dog_rates/status/823333489516937216/photo/1
427
         https://twitter.com/dog_rates/status/821153421864615936/photo/1
         https://twitter.com/dog_rates/status/813130366689148928/photo/1
498
         https://twitter.com/dog_rates/status/811647686436880384/photo/1
513
565
         https://twitter.com/dog_rates/status/802265048156610565/photo/1
570
         https://twitter.com/dog_rates/status/801854953262350336/photo/1
         https://twitter.com/dog_rates/status/800859414831898624/photo/1
576
611
         https://twitter.com/dog_rates/status/797165961484890113/photo/1
. . .
         https://twitter.com/dog_rates/status/693582294167244802/photo/1
1479
         https://twitter.com/dog_rates/status/692423280028966913/photo/1
1497
         https://twitter.com/dog_rates/status/692142790915014657/photo/1,https://twitter.c
1501
1523
         https://twitter.com/dog_rates/status/690607260360429569/photo/1
         https://twitter.com/dog_rates/status/686035780142297088/photo/1
1598
1605
         https://twitter.com/dog_rates/status/685681090388975616/photo/1
         https://twitter.com/dog_rates/status/684969860808454144/photo/1
1618
1630
         https://twitter.com/dog_rates/status/684538444857667585/video/1
         https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/684225744407494656/photo/1,https://twitter.com/dog_rates/status/68422574440749466/photo/1,https://twitter.com/dog_rates/status/6842257444074946/photo/1,https://twitter.com/dog_rates/status/68422574440749496/photo/1,https://twitter.com/dog_rates/status/684225744407499/photo/100074949/photo/10007499/photo/10007499/photo/1000749/photo/1000749/pho
1634
1663
         https://twitter.com/dog_rates/status/682808988178739200/photo/1
         https://twitter.com/dog_rates/status/681340665377193984/photo/1
1689
1774
         https://twitter.com/dog_rates/status/678023323247357953/photo/1
         https://twitter.com/dog_rates/status/676590572941893632/photo/1
1819
1842
         https://twitter.com/dog_rates/status/675870721063669760/photo/1
         https://twitter.com/dog_rates/status/675849018447167488/photo/1
1844
         https://twitter.com/dog_rates/status/675707330206547968/photo/1
1852
         1866
         https://twitter.com/dog_rates/status/674999807681908736/photo/1
1882
1885
         https://twitter.com/dog_rates/status/674793399141146624/photo/1
         https://twitter.com/dog_rates/status/674754018082705410/photo/1
1892
         https://twitter.com/dog_rates/status/674742531037511680/photo/1
1895
1905
         https://twitter.com/dog_rates/status/674606911342424069/photo/1
         https://twitter.com/dog_rates/status/674330906434379776/photo/1
1914
         https://twitter.com/dog_rates/status/673716320723169284/photo/1
1940
2036
         https://twitter.com/dog_rates/status/671729906628341761/photo/1
         https://twitter.com/dog_rates/status/671550332464455680/photo/1
2038
2149
         https://twitter.com/dog_rates/status/669684865554620416/photo/1
         https://twitter.com/dog_rates/status/669353438988365824/photo/1
2169
         https://twitter.com/dog_rates/status/668967877119254528/photo/1
2189
2298
         https://twitter.com/dog_rates/status/667070482143944705/photo/1
         rating_numerator
                                       rating_denominator
                                                                           name
                                                                                        dog_stage retweet_count
30
         12
                                        10
                                                                         NaN
                                                                                                         NaN
55
          17
                                        10
                                                                         NaN
                                                                                                         NaN
64
          14
                                        10
                                                                         NaN
                                                                                                         NaN
113
          10
                                        10
                                                                         NaN
                                                                                                         NaN
148
          12
                                        10
                                                                         NaN
                                                                                                         NaN
```

149	14	10	NaN		NaN
179	12	10	NaN		NaN
184	14	10	NaN		NaN
186	14	10	NaN		NaN
188	420	10	NaN		NaN
189	666	10	NaN		NaN
218	13	10	NaN		NaN
228	11	10	NaN		NaN
234	13	10	NaN		NaN
251	13	10	NaN		NaN
274	10	10	NaN		NaN
290	182	10	NaN		NaN
291	15	10	NaN		NaN
313	960	0	NaN		NaN
342	11	15	NaN		NaN
346	12	10	NaN		NaN
387	7	10	NaN		NaN
409	13	10	NaN		NaN
427	13	10	NaN		NaN
498	12	10	NaN		NaN
513	11	10	NaN		${\tt NaN}$
565	11	10	NaN	doggopupper	${\tt NaN}$
570	11	10	NaN		${\tt NaN}$
576	11	10	NaN	doggo	${\tt NaN}$
611	11	10	NaN		${\tt NaN}$
1479	11	10	NaN		NaN
1497	9	10	NaN		NaN
1501	13	10	NaN		NaN
1523	12	10	NaN		NaN
1598	4	20	NaN		NaN
1605	14	10	NaN		NaN
1618	5	10	NaN		NaN
1630	12	10	NaN		NaN
1634	143	130	NaN		NaN
1663	20	16	NaN		NaN
1689	5	10	NaN		NaN
1774	13	10	NaN		NaN
1819	7	10	NaN		NaN
1842	11	10	NaN		NaN
1844	9	10	NaN		NaN
1852	11	10	NaN		NaN
1866	13	10	NaN		NaN
1882	13	10	NaN		NaN
1885	13	10	NaN		NaN
1892	12	10	NaN		NaN
1895	11	10	NaN		NaN
1905	13	10	NaN		NaN

1914	13	10	NaN	NaN
1940	1	10	NaN	NaN
2036	13	10	NaN	NaN
2038	1	10	NaN	NaN
2149	11	10	NaN	NaN
2169	10	10	Tessa	NaN
2189	12	10	NaN	NaN
2298	10	10	NaN	${\tt NaN}$

favorite_count

- 30 ${\tt NaN}$
- 55 NaN
- 64 ${\tt NaN}$
- 113 ${\tt NaN}$
- 148 ${\tt NaN}$
- 149 ${\tt NaN}$
- 179 ${\tt NaN}$
- 184 ${\tt NaN}$
- 186 ${\tt NaN}$
- 188 ${\tt NaN}$
- 189 ${\tt NaN}$
- 218 ${\tt NaN}$
- 228 ${\tt NaN}$
- 234
- ${\tt NaN}$
- 251 ${\tt NaN}$ 274 ${\tt NaN}$
- 290 ${\tt NaN}$
- 291 ${\tt NaN}$
- 313 ${\tt NaN}$
- 342 NaN 346 ${\tt NaN}$
- 387 ${\tt NaN}$
- 409 ${\tt NaN}$
- 427 ${\tt NaN}$
- 498 NaN
- 513 ${\tt NaN}$
- 565 ${\tt NaN}$
- 570 NaN
- 576 NaN
- 611 NaN
- . . .
- 1479 NaN
- 1497 NaN
- 1501 NaN
- 1523 NaN
- 1598 NaN
- 1605 NaN
- 1618 NaN

```
1630 NaN
         1634 NaN
         1663 NaN
         1689 NaN
         1774 NaN
         1819 NaN
         1842 NaN
         1844 NaN
         1852 NaN
         1866 NaN
         1882 NaN
         1885 NaN
         1892 NaN
         1895 NaN
         1905 NaN
         1914 NaN
         1940 NaN
         2036 NaN
         2038 NaN
         2149 NaN
         2169 NaN
         2189 NaN
         2298 NaN
         [78 rows x 16 columns]
In [64]: Archive_clean = Archive_clean[Archive_clean["in_reply_to_status_id"].isnull()]
         Archive_clean = Archive_clean[Archive_clean["retweeted_status_id"].isnull()]
In [65]: Archive_clean.drop(['in_reply_to_status_id','in_reply_to_user_id','retweeted_status_id'
Test
In [66]: Archive_clean.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2097 entries, 0 to 2355
Data columns (total 11 columns):
                      2097 non-null int64
tweet_id
                      2097 non-null object
timestamp
                      2097 non-null object
source
                      2097 non-null object
text
                      2097 non-null object
expanded_urls
                      2097 non-null int64
rating_numerator
                      2097 non-null int64
rating_denominator
                      1494 non-null object
name
dog_stage
                      2097 non-null object
                      0 non-null float64
retweet_count
```

Now the table only has 2097 rows and in_reply_to_status_id,in_reply_to_user_id, retweeted_status_id,retweeted_status_user_id, retweeted_status_timestamp are removed. tweet_id column should be of object type, not integer.

7.0.1 Define

tweet_id columns in two will be both changed into object type.

The type of tweet id is changed successfully.

Next step will be source columns. There are 4 different kinds of source -- 'Twitter for iPhone','Vine - Make a Scene','Twitter Web Client',and 'TweetDeck'.

7.0.2 Define

Source column should be converted into 4 category of source -'Twitter for iPhone','Vine - Make a Scene','Twitter Web Client',and 'TweetDeck'.

Test

The source column is converted successfully, but the type of column is int64, which should be changed into category.

Erroneous datatypes (timestamp, source columns) Erroneous format in value of prediction1-3 dog breed, prediction_confidence1-3 have 6 decimals and Name is extracted from the word after 'This is', a lot of text does not follow this rule, some texts just have 'a', 'an', 'the'.

7.0.3 Define

timestamp should be removed '+0000', year and month variable are created and convert into dateti p1,p2,p3 dog breed should be all lower case and p1_conf, p2_conf, p3_conf should be trimmed int Name is very hard to clean, I will replace -'None', 'a', 'an', 'the' with nan value.

7.0.4 Code

```
In [72]: # To category
         Archive_clean['source'] = Archive_clean['source'].astype('category')
         # Strip '+0000'
         Archive_clean.timestamp = Archive_clean.timestamp.str.strip('+0000')
         # Extract year and month variable
         Archive_clean['month'] = Archive_clean['timestamp'].str.split('-').str.get(0) + Archive_
         Archive_clean['month'] = Archive_clean['month'].astype(str)
         Archive_clean['year'] = Archive_clean['timestamp'].str.split('-').str.get(0)
         # To datetime
         Archive_clean.timestamp = pd.to_datetime(Archive_clean.timestamp)
         # To lower case
         imagePrediction_clean['prediction1'] = imagePrediction_clean['prediction1'].str.lower()
         imagePrediction_clean['prediction2'] = imagePrediction_clean['prediction2'].str.lower()
         imagePrediction_clean['prediction3'] = imagePrediction_clean['prediction3'].str.lower()
         # to 4 decimal
         imagePrediction_clean.prediction_confidence1 = imagePrediction_clean.prediction_confide
         imagePrediction_clean.prediction_confidence2 = imagePrediction_clean.prediction_confide
```

imagePrediction_clean.prediction_confidence3 = imagePrediction_clean.prediction_confide

```
# replace 'None', a', 'an', 'the' with nan
                                       Archive_clean.name = Archive_clean.name.replace(['a', 'an', 'None', 'the'], np.nan)
                                       #To string
                                       Archive_clean['name'] = Archive_clean['name'].apply(str)
7.0.5 Test
In [73]: Archive_clean.timestamp.head()
Out[73]: 0
                                                        2017-08-01 16:23:56
                                                        2017-08-01 00:17:27
                                       2 2017-07-31 00:18:03
                                       3 2017-07-30 15:58:51
                                                        2017-07-29 16:00:24
                                      Name: timestamp, dtype: datetime64[ns]
In [74]: imagePrediction_clean[['prediction1','prediction2','prediction3']].head()
Out[74]:
                                                                                                   prediction1
                                                                                                                                                                                          prediction2
                                                                                                                                                                                                                                                                                     prediction3
                                      0 welsh_springer_spaniel collie
                                                                                                                                                                                                                                                   shetland_sheepdog
                                      1 redbone
                                                                                                                                                           miniature_pinscher rhodesian_ridgeback
                                                                                                                                                                                                                                                   bloodhound
                                      2 german_shepherd
                                                                                                                                                           malinois
                                      3 rhodesian_ridgeback
                                                                                                                                                           redbone
                                                                                                                                                                                                                                                  miniature_pinscher
                                       4 miniature_pinscher
                                                                                                                                                           rottweiler
                                                                                                                                                                                                                                                   doberman
In [75]: imagePrediction_clean[['prediction_confidence1','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence2','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','prediction_confidence3','predicti
Out[75]:
                                                   \verb|prediction_confidence|| | prediction_confidence|| | prediction_con
                                                                                                                                                                                                                                                                    0.0614
                                      0 0.4651
                                                                                                                                                            0.1567
                                      1 0.5068
                                                                                                                                                            0.0742
                                                                                                                                                                                                                                                                    0.0720
                                      2 0.5965
                                                                                                                                                            0.1386
                                                                                                                                                                                                                                                                    0.1162
                                      3 0.4081
                                                                                                                                                            0.3607
                                                                                                                                                                                                                                                                    0.2228
                                      4 0.5603
                                                                                                                                                           0.2437
                                                                                                                                                                                                                                                                    0.1546
In [76]: Archive_clean.name.value_counts()
Out[76]: nan
                                                                                                   672
                                      Charlie
                                                                                                   11
                                      Lucy
                                                                                                   11
                                      Oliver
                                                                                                   10
                                                                                                   10
                                      Cooper
                                      Penny
                                                                                                   9
                                      Tucker
                                                                                                   9
                                      Lola
                                                                                                   8
                                      Sadie
                                                                                                   8
                                      Winston
                                                                                                   8
                                       Toby
                                                                                                   7
```

Daisy	7
Stanley	6
Bella	6
Jax	6
Bailey	6
Во	6
Koda	6
Oscar	6
Milo	5
Leo	5
Buddy	5
Scout	5
Rusty	5
Louis	5
Dave	5
Chester	5
Bentley	5
Phil	4
Boomer	4
Eve	1
Willie	1
Brian	1
Carter	1
Sephie	1
Chef	1
Grizzwald	1
Perry	1
Buckley	1
Patch	1
Tom	1
Brudge	1
Donny	1
Tanner	1
Tater	1
Grizz	1
Kendall	1
Molly	1
incredibly	1
Grey	1
Butter	1
Hanz	1
Keet	1
Corey	1 1
Snicku	1
Jimbo Tiger	1
Tiger Scott	1
5000	Τ

```
Dallas
                     1
                     1
        space
        Name: name, Length: 952, dtype: int64
In [77]: text1 = Archive_clean[Archive_clean['rating_numerator'] == 5]['text']
        for x in text1:
           print(re.findall("\d+\.\d+", x))
['13.5']
[]
[]
П
[]
[]
[]
[]
In [78]: Archive_clean.loc[Archive_clean['rating_denominator'] == 0,['rating_numerator','rating_
        Archive_clean.loc[Archive_clean['rating_denominator'] == 2,['rating_numerator','rating_
        Archive_clean.loc[Archive_clean['tweet_id'] == '883482846933004288','rating_numerator']
        Archive_clean.loc[Archive_clean['tweet_id'] == 775096608509886464 ,
```

```
['rating_numerator', 'rating_denominator']] = 14,10
         Archive_clean.loc[Archive_clean['tweet_id'] == 740373189193256964,
                           ['rating_numerator', 'rating_denominator']] = 14,10
         Archive_clean.loc[Archive_clean['tweet_id'] == 682962037429899265,
                           ['rating_numerator', 'rating_denominator']] = 10,10
In [79]: imagePrediction_clean.loc[imagePrediction_clean['prediction1'].isin(['newfoundland', ']
         imagePrediction_clean.loc[imagePrediction_clean['prediction2'].isin(['newfoundland', ']
         imagePrediction_clean.loc[imagePrediction_clean['prediction3'].isin(['newfoundland', 'l
Test
In [80]: Archive_clean[Archive_clean['tweet_id'] == '883482846933004288'][['text', 'rating_numerat
Out [80]:
         45 This is Bella. She hopes her smile made you smile. If not, she is also offering you
             rating_numerator rating_denominator
         45 13.5
                               10
In [81]: Archive_clean['rating_denominator'].value_counts()
Out[81]: 10
                2081
         50
                3
                2
         11
         80
         170
         150
                1
         120
                1
         110
                1
         90
         70
         40
         20
         Name: rating_denominator, dtype: int64
In [82]: imagePrediction_clean[imagePrediction_clean['prediction3'] == 'mitten']
Out[82]:
                        tweet_id
                                                                           jpg_url \
         950 704859558691414016 https://pbs.twimg.com/media/CcgqBNVW8AE76lv.jpg
              most_confident_img_num prediction1 prediction_confidence1 \
         950 1
                                                  0.2844
                                      pug
              dogbreed_indicator1 prediction2 prediction_confidence2 \
         950
                                   teddy
                                               0.1563
             True
              dogbreed_indicator2 prediction3 prediction_confidence3 \
```

```
dogbreed_indicator3
         950 False
In [83]: imagePrediction_clean[imagePrediction_clean['prediction2'] == 'newfoundland']['dogbreed
Out[83]: 16
                 False
         22
                 False
         732
                 False
         1012
                 False
         1846
                 False
         1859
                 False
         1890
                 False
         Name: dogbreed_indicator2, dtype: bool
In [84]: imagePrediction_clean[imagePrediction_clean['prediction3'] == 'newfoundland']['dogbreed
Out[84]: 114
                 False
         491
                 False
                 False
         1147
         1540
                 False
         1842
                 False
         1868
                 False
         1875
                 False
         1994
                 False
         2032
                 False
         Name: dogbreed_indicator3, dtype: bool
In [85]: Archive_clean['rating'] = Archive_clean['rating_numerator'] / Archive_clean['rating_denomi
7.0.6 Test
In [86]: Archive_clean[['rating','rating_numerator','rating_denominator']].head()
Out[86]:
            rating rating_numerator rating_denominator
         0 1.3
                    13.0
         1 1.3
                    13.0
                                       10
         2 1.2
                    12.0
                                       10
         3 1.3
                    13.0
                                       10
         4 1.2
                    12.0
                                       10
   Archive_clean['rating'] column is successfully created.
Store Files
In [87]: Archive_clean.to_csv('./archive_master.csv', index=False)
         imagePrediction_clean.to_csv('./imagePrediction_master.csv', index=False)
```

0.1389

mitten

950 False

In [89]: Archive_clean.to_csv('./master.csv', index=False)

In [88]: twitter_archive_master = pd.merge(Archive_clean, imagePrediction_clean, on='tweet_id')