wrangle_act

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1 Project: We Rate Dogs

Data Wrangling and Analyzing

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2 Introduction

Real-world data rarely comes clean. Using Python and its libraries, you will gather data from a variety of sources regarding one of Twitter accounts (We Rate Dogs)and in a variety of formats, assess its quality and tidiness, then clean it. This is called data wrangling. That's the first part. Second part would be to merge all datasets in one master dataset then conduct different types of analyses and visualization. Third part will be consisted of two PDFs. One for the Data Warngling efforts and the second one for Analyses and Visulizations

2.1 First Part - Data Wrangling

- Gathering Data - Download CSV file - Create a TSV file from URL - Download Twitter API and JSON #### - Assessing Data - Quality - Tidiness #### - Cleaning Data ## Second Part - Storing, Analyzing, and Visualizing Wrangled Data ## Third Part - Reporting on: - Wrangling Efforts - Data Analyses and Visualizations

```
In [133]: # Import all required libraries
    import pandas as pd
    import json
    import requests
    import numpy as np
    import tweepy
    import matplotlib.pyplot as plt
    import random
    import matplotlib
    %matplotlib inline
    import seaborn as sns
    import time
```

2.2 First Part - Data Wrangling

2.2.1 Gathering Data

Download CSV file twitter_archive.csv

```
In [2]: # Read downloaded twitter archive CSV
        twitter_archive = pd.read_csv('twitter-archive-enhanced.csv')
       twitter archive.head()
Out[2]:
                     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 \
         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" r...</pre>
          <a href="http://twitter.com/download/iphone" r...</pre>
        2 <a href="http://twitter.com/download/iphone" r...
        3 <a href="http://twitter.com/download/iphone" r...</pre>
        4 <a href="http://twitter.com/download/iphone" r...
                                                         text retweeted_status_id \
         This is Phineas. He's a mystical boy. Only eve...
                                                                               NaN
        1 This is Tilly. She's just checking pup on you...
                                                                              NaN
        2 This is Archie. He is a rare Norwegian Pouncin...
                                                                               NaN
        3 This is Darla. She commenced a snooze mid meal...
                                                                               NaN
        4 This is Franklin. He would like you to stop ca...
                                                                               NaN
           retweeted_status_user_id retweeted_status_timestamp
        0
                                NaN
                                                            NaN
        1
                                NaN
                                                            NaN
        2
                                NaN
                                                            NaN
        3
                                NaN
                                                            NaN
                                                            NaN
                                               expanded_urls rating_numerator \
        0 https://twitter.com/dog_rates/status/892420643...
        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
   rating_denominator
                           name doggo floofer pupper puppo
0
                   10
                        Phineas None
                                         None
                                                None
                                                      None
1
                                         None
                                                None
                   10
                          Tilly None
                                                      None
2
                   10
                         Archie None
                                         None
                                                {	t None}
                                                      None
3
                   10
                          Darla None
                                         None
                                                None None
                      Franklin None
                                                None None
4
                   10
                                         None
```

Create a TSV file from URL

```
In [3]: # download url
                     url = "https://d17h27t6h515a5.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.cloudfront.net/topher/2017/August/599fd2ad_image-predictions.clo
                     response = requests.get(url)
                      # Open tsv and write contents
                     with open('image.tsv', mode ='wb') as file:
                               file.write(response.content)
                     # Read TSV file
                     image = pd.read_csv('image.tsv', sep='\t')
                     image.head()
Out[3]:
                                                       tweet_id
                                                                                                                                                                                            jpg_url \
                                                                                 https://pbs.twimg.com/media/CT4udnOWwAAOaMy.jpg
                     0
                            666020888022790149
                     1 666029285002620928
                                                                                 https://pbs.twimg.com/media/CT42GRgUYAA5iDo.jpg
                                                                                  https://pbs.twimg.com/media/CT4521TWwAEvMyu.jpg
                     2 666033412701032449
                                                                                  https://pbs.twimg.com/media/CT5Dr8HUEAA-lEu.jpg
                     3 666044226329800704
                            666049248165822465
                                                                                 https://pbs.twimg.com/media/CT5IQmsXIAAKY4A.jpg
                                                                                                                      p1_conf p1_dog
                                                                                                                                                                                                              p2 \
                             img_num
                                                                                                         р1
                     0
                                                    Welsh_springer_spaniel 0.465074
                                                                                                                                                    True
                                             1
                                                                                                                                                                                                    collie
                     1
                                                                                            redbone
                                            1
                                                                                                                   0.506826
                                                                                                                                                    True miniature_pinscher
                     2
                                            1
                                                                       German_shepherd 0.596461
                                                                                                                                                    True
                                                                                                                                                                                               malinois
                     3
                                             1
                                                             Rhodesian_ridgeback 0.408143
                                                                                                                                                                                                 redbone
                                                                                                                                                    True
                                                               miniature_pinscher 0.560311
                     4
                                                                                                                                                    True
                                                                                                                                                                                         Rottweiler
                               p2_conf p2_dog
                                                                                                                                       p3_conf
                                                                                                                                                              p3_dog
                                                                                                                         рЗ
                     0 0.156665
                                                             True
                                                                                  Shetland_sheepdog 0.061428
                                                                                                                                                                    True
                     1 0.074192
                                                             True Rhodesian_ridgeback 0.072010
                                                                                                                                                                    True
                     2 0.138584
                                                                                                    bloodhound 0.116197
                                                             True
                                                                                                                                                                    True
                     3 0.360687
                                                             True
                                                                               miniature_pinscher 0.222752
                                                                                                                                                                    True
                     4 0.243682
                                                                                                         Doberman 0.154629
                                                                                                                                                                    True
                                                             True
```

Download Twitter API and JSON

```
In [4]: # Tweeter API Developer Credentials
        import tweepy
        consumer_key = 'R413JLU7i3jiEyvzmji6DLAj0'
        consumer_secret = 'ecp6uYvKa7ankFTUNTTBUXf2fb4XNODQzmkt6Vc7wRoOjQecu3'
        access_token = '1061800277378981888-lgTwRZJyDDnQ2VegCRlRVA21W8x9MN'
        access_secret = 'wR7fMnT1wCYut3b7P1QZHQ37pY8lQUkUdtuersUT0mpeY'
        auth = tweepy.OAuthHandler(consumer_key, consumer_secret)
        auth.set_access_token(access_token, access_secret)
        api = tweepy.API(auth)
In [5]: #Twitter Query using tweet_id information from the twitter_archive CSV file.
        tweet_ids = list(twitter_archive.tweet_id)
        tweet_data = {}
        error_list = []
        for tweet in tweet_ids:
            try:
                tweet_status = api.get_status(tweet,
                                              wait_on_rate_limit=True,
                                              wait_on_rate_limit_notify=True)
                tweet_data[str(tweet)] = tweet_status._json
                print("Error for tweet_id: " + str(tweet))
                error_list.append(tweet)
Error for tweet_id: 888202515573088257
Error for tweet_id: 873697596434513921
Error for tweet_id: 872668790621863937
Error for tweet_id: 869988702071779329
Error for tweet_id: 866816280283807744
Error for tweet_id: 861769973181624320
Error for tweet_id: 845459076796616705
Error for tweet_id: 842892208864923648
Error for tweet id: 837012587749474308
Error for tweet_id: 827228250799742977
Error for tweet id: 802247111496568832
Error for tweet_id: 775096608509886464
Error for tweet_id: 770743923962707968
Rate limit reached. Sleeping for: 733
Error for tweet_id: 754011816964026368
Rate limit reached. Sleeping for: 734
```

In [9]: # size of dataframe

```
print("The number of tweed_ids is", len(tweet_data.keys()))
        # The number of the errors
        print("The number of tweet_ids with error is", len(error_list))
The number of tweed ids is 2342
The number of tweet_ids with error is 14
In [10]: # Write JSON in a text file
         with open('tweet_json.txt', 'w') as outfile:
             json.dump(tweet_data, outfile, sort_keys = True, indent=4, ensure_ascii = False)
         # Read the new JSON file
         twitter_api = pd.read_json('tweet_json.txt', orient='index')
         twitter_api.head()
Out[10]:
                                                       coordinates
                                         contributors
                                                                             created_at \
         1991-02-08 13:48:08.022790149
                                                  NaN
                                                               NaN 2015-11-15 22:32:08
         1991-02-08 16:08:05.002620928
                                                               NaN 2015-11-15 23:05:30
                                                  NaN
         1991-02-08 17:16:52.701032449
                                                  NaN
                                                               NaN 2015-11-15 23:21:54
         1991-02-08 20:17:06.329800704
                                                               NaN 2015-11-16 00:04:52
                                                  NaN
         1991-02-08 21:40:48.165822465
                                                  NaN
                                                               NaN 2015-11-16 00:24:50
                                                                                   entities \
         1991-02-08 13:48:08.022790149
                                         {'hashtags': [], 'media': [{'display_url': 'pi...
         1991-02-08 16:08:05.002620928
                                         {'hashtags': [], 'media': [{'display_url': 'pi...
                                         {'hashtags': [], 'media': [{'display_url': 'pi...
         1991-02-08 17:16:52.701032449
                                         {'hashtags': [], 'media': [{'display_url': 'pi...
         1991-02-08 20:17:06.329800704
                                         {'hashtags': [], 'media': [{'display_url': 'pi...
         1991-02-08 21:40:48.165822465
                                                                          extended_entities \
                                         {'media': [{'display_url': 'pic.twitter.com/BL...
         1991-02-08 13:48:08.022790149
         1991-02-08 16:08:05.002620928
                                         {'media': [{'display_url': 'pic.twitter.com/r7...
                                         {'media': [{'display_url': 'pic.twitter.com/y6...
         1991-02-08 17:16:52.701032449
                                         {'media': [{'display_url': 'pic.twitter.com/DW...
         1991-02-08 20:17:06.329800704
         1991-02-08 21:40:48.165822465
                                         {'media': [{'display_url': 'pic.twitter.com/4B...
                                         favorite_count favorited geo
         1991-02-08 13:48:08.022790149
                                                   2544
                                                                 0
                                                                    {\tt NaN}
         1991-02-08 16:08:05.002620928
                                                    129
                                                                 0 NaN
         1991-02-08 17:16:52.701032449
                                                    125
                                                                 0 NaN
         1991-02-08 20:17:06.329800704
                                                    296
                                                                    {\tt NaN}
         1991-02-08 21:40:48.165822465
                                                    107
                                                                    {\tt NaN}
                                                                          id_str \
                                                         id
         1991-02-08 13:48:08.022790149
                                         666020888022790144
                                                             666020888022790144
         1991-02-08 16:08:05.002620928
                                        666029285002620928
                                                             666029285002620928
         1991-02-08 17:16:52.701032449
                                        666033412701032448
                                                             666033412701032448
         1991-02-08 20:17:06.329800704 666044226329800704 666044226329800704
```

```
1991-02-08 21:40:48.165822465 666049248165822464 666049248165822464
1991-02-08 13:48:08.022790149
1991-02-08 16:08:05.002620928
1991-02-08 17:16:52.701032449
1991-02-08 20:17:06.329800704
1991-02-08 21:40:48.165822465
                               quoted_status
                                               quoted_status_id
1991-02-08 13:48:08.022790149
                                                            NaN
                                          NaN
1991-02-08 16:08:05.002620928
                                          NaN
                                                            NaN
1991-02-08 17:16:52.701032449
                                                            NaN
                                          NaN
1991-02-08 20:17:06.329800704
                                          NaN
                                                            NaN
1991-02-08 21:40:48.165822465
                                          NaN
                                                            NaN
                                quoted_status_id_str retweet_count
                                                                       retweeted
1991-02-08 13:48:08.022790149
                                                                  508
                                                                               0
                                                  NaN
1991-02-08 16:08:05.002620928
                                                                               0
                                                  NaN
                                                                   47
1991-02-08 17:16:52.701032449
                                                  NaN
                                                                   44
                                                                               0
1991-02-08 20:17:06.329800704
                                                  NaN
                                                                  139
                                                                               0
1991-02-08 21:40:48.165822465
                                                  NaN
                                                                   40
                                                                               0
                                retweeted_status
1991-02-08 13:48:08.022790149
                                              NaN
1991-02-08 16:08:05.002620928
                                              NaN
1991-02-08 17:16:52.701032449
                                              NaN
1991-02-08 20:17:06.329800704
                                              NaN
1991-02-08 21:40:48.165822465
                                              NaN
                                                                             source
1991-02-08 13:48:08.022790149
                                <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-08 16:08:05.002620928
                                <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-08 17:16:52.701032449
                                <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-08 20:17:06.329800704
                                <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-08 21:40:48.165822465
                                <a href="http://twitter.com/download/iphone" r...</pre>
                                                                               text
1991-02-08 13:48:08.022790149
                                Here we have a Japanese Irish Setter. Lost eye...
                                This is a western brown Mitsubishi terrier. Up...
1991-02-08 16:08:05.002620928
1991-02-08 17:16:52.701032449
                                Here is a very happy pup. Big fan of well-main...
1991-02-08 20:17:06.329800704
                                This is a purebred Piers Morgan. Loves to Netf...
1991-02-08 21:40:48.165822465
                                Here we have a 1949 1st generation vulpix. Enj...
                                truncated \
```

0

0

0

1991-02-08 13:48:08.022790149

1991-02-08 16:08:05.002620928

1991-02-08 17:16:52.701032449

```
1991-02-08 20:17:06.329800704 0
1991-02-08 21:40:48.165822465 0

user
1991-02-08 13:48:08.022790149 {'contributors_enabled': False, 'created_at': ...
1991-02-08 16:08:05.002620928 {'contributors_enabled': False, 'created_at': ...
1991-02-08 17:16:52.701032449 {'contributors_enabled': False, 'created_at': ...
1991-02-08 20:17:06.329800704 {'contributors_enabled': False, 'created_at': ...
1991-02-08 21:40:48.165822465 {'contributors_enabled': False, 'created_at': ...
```

[5 rows x 30 columns]

2.2.2 Assessing Data

Intial assessing for the three file visual and programatic:

In [11]: twitter_archive

Out[11]:	tweet_id	in_reply_to_status_id	<pre>in_reply_to_user_id \</pre>
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

0.0	000000444704445500	27 27	77 77
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		
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		
5	2017-07-29 00:08:17 +0000		
6	2017-07-28 16:27:12 +0000		
7	2017-07-28 00:22:40 +0000		
8	2017-07-27 16:25:51 +0000		
9	2017-07-26 15:59:51 +0000		
10	2017-07-26 00:31:25 +0000		
11	2017-07-25 16:11:53 +0000		
12	2017-07-25 01:55:32 +0000		
13	2017-07-25 00:10:02 +0000		

```
2017-07-24 17:02:04 +0000
14
15
      2017-07-24 00:19:32 +0000
      2017-07-23 00:22:39 +0000
16
      2017-07-22 16:56:37 +0000
17
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
      2017-07-18 00:07:08 +0000
25
26
      2017-07-17 16:17:36 +0000
27
      2017-07-16 23:58:41 +0000
28
      2017-07-16 20:14:00 +0000
29
      2017-07-15 23:25:31 +0000
. . .
2326 2015-11-17 00:24:19 +0000
2327
     2015-11-17 00:06:54 +0000
2328
     2015-11-16 23:23:41 +0000
2329
     2015-11-16 21:54:18 +0000
2330
     2015-11-16 21:10:36 +0000
     2015-11-16 20:32:58 +0000
2331
2332 2015-11-16 20:01:42 +0000
2333
     2015-11-16 19:31:45 +0000
     2015-11-16 16:37:02 +0000
2334
2335
     2015-11-16 16:11:11 +0000
2336
     2015-11-16 15:14:19 +0000
      2015-11-16 14:57:41 +0000
2337
2338
     2015-11-16 04:02:55 +0000
2339
     2015-11-16 03:55:04 +0000
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
2345 2015-11-16 01:22:45 +0000
2346
     2015-11-16 01:01:59 +0000
     2015-11-16 00:55:59 +0000
2347
2348 2015-11-16 00:49:46 +0000
     2015-11-16 00:35:11 +0000
2349
2350
     2015-11-16 00:30:50 +0000
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
```

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source \
0
       <a href="http://twitter.com/download/iphone" r...</pre>
1
       <a href="http://twitter.com/download/iphone" r...</pre>
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       <a href="http://twitter.com/download/iphone" r...</pre>
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       <a href="http://twitter.com/download/iphone" r...</pre>
2341
       <a href="http://twitter.com/download/iphone" r...</pre>
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2342
      <a href="http://twitter.com/download/iphone" r...
2343
      <a href="http://twitter.com/download/iphone" r...</pre>
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      <a href="http://twitter.com/download/iphone" r...</pre>
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      <a href="http://twitter.com/download/iphone" r...</pre>
2354
      <a href="http://twitter.com/download/iphone" r...</pre>
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...
                                                                             NaN
1
      This is Tilly. She's just checking pup on you...
                                                                            NaN
2
      This is Archie. He is a rare Norwegian Pouncin...
                                                                             NaN
3
      This is Darla. She commenced a snooze mid meal...
                                                                             NaN
4
      This is Franklin. He would like you to stop ca...
                                                                             NaN
5
      Here we have a majestic great white breaching ...
                                                                             NaN
6
      Meet Jax. He enjoys ice cream so much he gets ...
                                                                             NaN
7
                                                                             NaN
      When you watch your owner call another dog a g...
8
      This is Zoey. She doesn't want to be one of th...
                                                                             NaN
9
      This is Cassie. She is a college pup. Studying...
                                                                             NaN
      This is Koda. He is a South Australian decksha...
10
                                                                             NaN
11
      This is Bruno. He is a service shark. Only get...
                                                                             NaN
12
      Here's a puppo that seems to be on the fence a...
                                                                             NaN
13
      This is Ted. He does his best. Sometimes that'...
                                                                             NaN
14
      This is Stuart. He's sporting his favorite fan...
                                                                             NaN
15
      This is Oliver. You're witnessing one of his m...
                                                                             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 ...
                                                                             {\tt NaN}
19
      RT @dog_rates: This is Canela. She attempted s...
                                                                    8.874740e+17
20
      This is Gerald. He was just told he didn't get...
                                                                             NaN
21
      This is Jeffrey. He has a monopoly on the pool...
                                                                             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 ...
                                                                             {\tt NaN}
25
      This... is a Jubilant Antarctic House Bear. We...
                                                                             NaN
26
      This is Maya. She's very shy. Rarely leaves he...
                                                                             NaN
      This is Mingus. He's a wonderful father to his...
27
                                                                             NaN
28
      This is Derek. He's late for a dog meeting. 13...
                                                                             NaN
29
      This is Roscoe. Another pupper fallen victim t...
                                                                             NaN
                                                                              . . .
2326
      This is quite the dog. Gets really excited whe...
                                                                             {\tt NaN}
```

```
NaN
2327
      This is a southern Vesuvius bumblegruff. Can d...
2328
      Oh goodness. A super rare northeast Qdoba kang...
                                                                            NaN
2329
      Those are sunglasses and a jean jacket. 11/10 ...
                                                                            NaN
2330
      Unique dog here. Very small. Lives in containe...
                                                                            {\tt NaN}
2331
      Here we have a mixed Asiago from the Galápagos...
                                                                            NaN
2332
      Look at this jokester thinking seat belt laws ....
                                                                            NaN
2333
      This is an extremely rare horned Parthenon. No...
                                                                            NaN
2334
      This is a funny dog. Weird toes. Won't come do...
                                                                            NaN
2335
                                                                            NaN
      This is an Albanian 3 1/2 legged Episcopalian...
2336
         Can take selfies 11/10 https://t.co/ws2AMaNwPW
                                                                            NaN
2337
      Very concerned about fellow dog trapped in com...
                                                                            NaN
2338
      Not familiar with this breed. No tail (weird)...
                                                                           NaN
2339
      Oh my. Here you are seeing an Adobe Setter giv...
                                                                            NaN
2340
      Can stand on stump for what seems like a while...
                                                                            NaN
2341
      This appears to be a Mongolian Presbyterian mi...
                                                                            NaN
2342
                                                                            NaN
      Here we have a well-established sunblockerspan...
2343
      Let's hope this flight isn't Malaysian (lol). ...
                                                                            NaN
2344
                                                                           NaN
      Here we have a northern speckled Rhododendron...
2345
      This is the happiest dog you will ever see. Ve...
                                                                            NaN
2346
      Here is the Rand Paul of retrievers folks! He'...
                                                                            NaN
2347
      My oh my. This is a rare blond Canadian terrie...
                                                                            NaN
2348
      Here is a Siberian heavily armored polar bear ...
                                                                            NaN
      This is an odd dog. Hard on the outside but lo...
                                                                            NaN
2350
                                                                            NaN
      This is a truly beautiful English Wilson Staff...
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
      This is a western brown Mitsubishi terrier. Up...
2354
                                                                            NaN
2355
     Here we have a Japanese Irish Setter. Lost eye...
                                                                            NaN
      retweeted_status_user_id retweeted_status_timestamp
0
                            NaN
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1
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16

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17
                                    {\tt NaN}
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                        4.196984e+09
                                           2017-07-19 00:47:34 +0000
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2354
                                    {\tt NaN}
                                                                         NaN
2355
                                    NaN
                                                                         NaN
                                                         expanded_urls rating_numerator \
       https://twitter.com/dog_rates/status/892420643...
0
                                                                                                 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
      https://twitter.com/dog_rates/status/889880896...
11
                                                                         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
      https://twitter.com/dog_rates/status/889278841...
15
                                                                         13
      https://twitter.com/dog_rates/status/888917238...
16
                                                                         12
17
      https://twitter.com/dog_rates/status/888804989...
                                                                        13
18
      https://twitter.com/dog_rates/status/888554962...
                                                                        13
19
      https://twitter.com/dog_rates/status/887473957...
                                                                        13
20
      https://twitter.com/dog_rates/status/888078434...
                                                                         12
      https://twitter.com/dog_rates/status/887705289...
21
                                                                         13
      https://twitter.com/dog_rates/status/887517139...
22
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23
      https://twitter.com/dog_rates/status/887473957...
                                                                         13
24
      https://twitter.com/dog_rates/status/887343217...
                                                                        13
25
      https://twitter.com/dog_rates/status/887101392...
                                                                         12
26
      https://twitter.com/dog_rates/status/886983233...
                                                                        13
27
      https://www.gofundme.com/mingusneedsus,https:/...
                                                                         13
      https://twitter.com/dog_rates/status/886680336...
28
                                                                         13
29
      https://twitter.com/dog_rates/status/886366144...
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2326
      https://twitter.com/dog_rates/status/666411507...
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      https://twitter.com/dog_rates/status/666407126...
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2327
2328
      https://twitter.com/dog_rates/status/666396247...
                                                                          9
2329
      https://twitter.com/dog_rates/status/666373753...
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2330
      https://twitter.com/dog_rates/status/666362758...
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2331
      https://twitter.com/dog_rates/status/666353288...
                                                                          8
      https://twitter.com/dog_rates/status/666345417...
2332
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      https://twitter.com/dog_rates/status/666337882...
2333
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2334
      https://twitter.com/dog_rates/status/666293911...
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2335
      https://twitter.com/dog_rates/status/666287406...
                                                                          1
      https://twitter.com/dog_rates/status/666273097...
2336
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2337
      https://twitter.com/dog_rates/status/666268910...
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      https://twitter.com/dog_rates/status/666104133...
2338
                                                                          1
2339
      https://twitter.com/dog_rates/status/666102155...
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2340
      https://twitter.com/dog_rates/status/666099513...
                                                                          8
      https://twitter.com/dog_rates/status/666094000...
2341
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2342
      https://twitter.com/dog_rates/status/666082916...
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2343
      https://twitter.com/dog_rates/status/666073100...
                                                                         10
2344
      https://twitter.com/dog_rates/status/666071193...
                                                                          9
```

```
https://twitter.com/dog_rates/status/666063827...
2345
                                                                        10
2346
     https://twitter.com/dog_rates/status/666058600...
                                                                        8
2347
      https://twitter.com/dog_rates/status/666057090...
                                                                         9
2348
     https://twitter.com/dog_rates/status/666055525...
                                                                        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...
2351
                                                                         5
     https://twitter.com/dog_rates/status/666044226...
2352
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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
0	10	Phineas	None	None	None	None
1	10	Tilly	None	None	None	None
2	10	Archie	None	None	None	None
3	10	Darla	None	None	None	None
4	10	Franklin	None	None	None	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	None
9	10	Cassie	doggo	None	None	None
10	10	Koda	None	None	None	None
11	10	${\tt Bruno}$	None	None	None	${\tt None}$
12	10	${\tt None}$	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	None	${\tt None}$
16	10	Jim	None	None	None	${\tt None}$
17	10	Zeke	None	None	None	None
18	10	Ralphus	${\tt None}$	${\tt None}$	None	${\tt None}$
19	10	Canela	${\tt None}$	None	None	None
20	10	Gerald	${\tt None}$	None	None	None
21	10	Jeffrey	${\tt None}$	${\tt None}$	${\tt None}$	${\tt None}$
22	10	such	${\tt None}$	None	None	${\tt None}$
23	10	Canela	None	None	None	${\tt None}$
24	10	${\tt None}$	None	None	None	None
25	10	${\tt None}$	None	None	None	None
26	10	Maya	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	${\tt None}$	None	None
2327	10	a	None	None	None	None
2328	10	None	None	None	None	None
2329	10	None	None	None	None	${\tt None}$

2330	10	None	None	${\tt None}$	None	${\tt None}$
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]

In [12]: # Get Data info

twitter_archive.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2356 entries, 0 to 2355
Data columns (total 17 columns):

tweet_id 2356 non-null int64 78 non-null float64 in_reply_to_status_id in_reply_to_user_id 78 non-null float64 2356 non-null object timestamp 2356 non-null object source text 2356 non-null object ${\tt retweeted_status_id}$ 181 non-null float64 retweeted_status_user_id 181 non-null float64 retweeted_status_timestamp 181 non-null object 2297 non-null object expanded_urls rating_numerator 2356 non-null int64 2356 non-null int64 rating_denominator 2356 non-null object name

```
2356 non-null object
doggo
                               2356 non-null object
floofer
                               2356 non-null object
pupper
                               2356 non-null object
puppo
dtypes: float64(4), int64(3), object(10)
memory usage: 313.0+ KB
In [13]: # Get summary of our quantative data
         twitter_archive.describe()
Out [13]:
                     tweet_id in_reply_to_status_id in_reply_to_user_id \
         count
                2.356000e+03
                                         7.800000e+01
                                                               7.800000e+01
                7.427716e+17
                                        7.455079e+17
                                                               2.014171e+16
         mean
                6.856705e+16
                                        7.582492e+16
                                                               1.252797e+17
         std
                                                               1.185634e+07
         min
                6.660209e+17
                                         6.658147e+17
         25%
                6.783989e+17
                                         6.757419e+17
                                                               3.086374e+08
         50%
                7.196279e+17
                                         7.038708e+17
                                                               4.196984e+09
         75%
                7.993373e+17
                                         8.257804e+17
                                                               4.196984e+09
                8.924206e+17
                                                               8.405479e+17
                                         8.862664e+17
         max
                retweeted_status_id retweeted_status_user_id
                                                                  rating_numerator
                        1.810000e+02
                                                   1.810000e+02
                                                                       2356.000000
         count
                                                   1.241698e+16
                        7.720400e+17
                                                                         13.126486
         mean
         std
                        6.236928e+16
                                                   9.599254e+16
                                                                         45.876648
         min
                        6.661041e+17
                                                   7.832140e+05
                                                                          0.000000
         25%
                        7.186315e+17
                                                   4.196984e+09
                                                                         10.000000
         50%
                        7.804657e+17
                                                   4.196984e+09
                                                                         11.000000
         75%
                        8.203146e+17
                                                   4.196984e+09
                                                                         12.000000
                        8.874740e+17
                                                   7.874618e+17
                                                                       1776.000000
         max
                rating_denominator
                        2356.000000
         count
         mean
                          10.455433
         std
                           6.745237
                           0.000000
         min
         25%
                          10.000000
         50%
                          10.000000
                          10.000000
         75%
                         170.000000
         max
In [14]: image
Out[14]:
                          tweet_id
                                                                                jpg_url \
         0
                                      https://pbs.twimg.com/media/CT4udnOWwAAOaMy.jpg
               666020888022790149
         1
               666029285002620928
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         2
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                                      https://pbs.twimg.com/media/CT4521TWwAEvMyu.jpg
         3
               666044226329800704
                                      https://pbs.twimg.com/media/CT5Dr8HUEAA-1Eu.jpg
               666049248165822465
                                      https://pbs.twimg.com/media/CT5IQmsXIAAKY4A.jpg
```

```
5
      666050758794694657
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6
                            https://pbs.twimg.com/media/CT5KoJ1WoAAJash.jpg
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7
      666055525042405380
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8
                            https://pbs.twimg.com/media/CT5PY90WoAAQGLo.jpg
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9
      666058600524156928
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                            https://pbs.twimg.com/media/CT5Vg_wXIAAXfnj.jpg
10
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11
      666071193221509120
                            https://pbs.twimg.com/media/CT5cN_3WEAA1OoZ.jpg
12
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                            https://pbs.twimg.com/media/CT5d9DZXAAALcwe.jpg
13
      666082916733198337
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                            https://pbs.twimg.com/media/CT5w9gUW4AAsBNN.jpg
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16
                            https://pbs.twimg.com/media/CT54YGiWUAEZnoK.jpg
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17
      666104133288665088
                            https://pbs.twimg.com/media/CT56LSZWoAAlJj2.jpg
18
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                            https://pbs.twimg.com/media/CT8QCd1WEAADXws.jpg
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                            https://pbs.twimg.com/media/CT8g3BpUEAAuFjg.jpg
21
      666293911632134144
                            https://pbs.twimg.com/media/CT8mx7KW4AEQu8N.jpg
22
      666337882303524864
                            https://pbs.twimg.com/media/CT90wFIWEAMuRje.jpg
23
      666345417576210432
                            https://pbs.twimg.com/media/CT9Vn7PWoAA_ZCM.jpg
24
      666353288456101888
                            https://pbs.twimg.com/media/CT9cxOtUEAAhNN_.jpg
25
      666362758909284353
                            https://pbs.twimg.com/media/CT9lXGsUcAAyUFt.jpg
26
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      666407126856765440
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29
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                            https://pbs.twimg.com/media/CT-RugiWIAELEaq.jpg
2045
      886366144734445568
                            https://pbs.twimg.com/media/DEOBTnQUwAApKEH.jpg
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      886680336477933568
                            https://pbs.twimg.com/media/DE4fEDzWAAAyHMM.jpg
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2049
                            https://pbs.twimg.com/media/DE-eAq6UwAA-jaE.jpg
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2050
      887343217045368832
                          https://pbs.twimg.com/ext_tw_video_thumb/88734...
2051
      887473957103951883
                            https://pbs.twimg.com/media/DFDw2tyUQAAAFke.jpg
2052
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                          https://pbs.twimg.com/ext_tw_video_thumb/88751...
2053
                            https://pbs.twimg.com/media/DFHDQBbXgAEqY7t.jpg
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2057
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      888804989199671297
2058
      888917238123831296
                            https://pbs.twimg.com/media/DFYRgsOUQAARGhO.jpg
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      889278841981685760
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                            https://pbs.twimg.com/media/DFi579UWsAAatzw.jpg
2063
      889880896479866881
                            https://pbs.twimg.com/media/DF199B1WsAITKsg.jpg
2064
      890006608113172480
                            https://pbs.twimg.com/media/DFnwSY4WAAAMliS.jpg
                            \verb|https://pbs.twimg.com/media/DFrEyVuWOAAO3t9.jpg|
2065
      890240255349198849
2066
      890609185150312448
                            https://pbs.twimg.com/media/DFwUU__XcAEpyXI.jpg
```

```
2067
      890729181411237888
                              https://pbs.twimg.com/media/DFyBahAVwAAhUTd.jpg
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      890971913173991426
                              https://pbs.twimg.com/media/DF1e0mZXUAALUcq.jpg
2069
      891087950875897856
                              https://pbs.twimg.com/media/DF3HwyEWsAABqE6.jpg
2070
                              https://pbs.twimg.com/media/DF6hr6BUMAAzZgT.jpg
      891327558926688256
                              https://pbs.twimg.com/media/DF_q7IAWsAEuuN8.jpg
2071
      891689557279858688
                              https://pbs.twimg.com/media/DGBdLU1WsAANxJ9.jpg
2072
      891815181378084864
2073
      892177421306343426
                              https://pbs.twimg.com/media/DGGmoV4XsAAUL6n.jpg
2074
      892420643555336193
                              https://pbs.twimg.com/media/DGKD1-bXoAAIAUK.jpg
      img_num
                                                p1_conf p1_dog
0
             1
                                               0.465074
                     Welsh_springer_spaniel
                                                            True
             1
                                     redbone
1
                                               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
                        Bernese_mountain_dog
                                                            True
             1
                                               0.651137
6
             1
                                  box_turtle
                                               0.933012
                                                           False
7
             1
                                         chow
                                               0.692517
                                                            True
8
             1
                                                           False
                               shopping_cart
                                               0.962465
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
                                          pug
14
             1
                                                            True
                                  bloodhound
                                               0.195217
15
             1
                                               0.582330
                                                            True
                                        Lhasa
16
             1
                              English_setter
                                               0.298617
                                                            True
17
             1
                                               0.965932
                                                           False
18
             1
                            desktop_computer
                                               0.086502
                                                           False
19
             1
                           Italian_greyhound
                                               0.176053
                                                            True
20
                                 Maltese_dog
                                                            True
             1
                                               0.857531
21
             1
                            three-toed_sloth
                                                           False
                                               0.914671
22
             1
                                               0.416669
                                                           False
                                           ОX
23
             1
                            golden_retriever
                                               0.858744
                                                            True
             1
24
                                    malamute
                                                            True
                                               0.336874
25
             1
                                  guinea_pig
                                               0.996496
                                                           False
26
             1
                soft-coated_wheaten_terrier
                                               0.326467
                                                            True
27
             1
                                                            True
                                   Chihuahua
                                               0.978108
28
             1
                    black-and-tan_coonhound
                                               0.529139
                                                            True
29
             1
                                               0.404640
                                                           False
                                         coho
2045
             1
                              French_bulldog
                                               0.999201
                                                            True
             1
                                 convertible
                                                           False
2046
                                               0.738995
             1
2047
                                      kuvasz
                                               0.309706
                                                            True
             2
2048
                                   Chihuahua
                                               0.793469
                                                            True
2049
             1
                                     Samoyed
                                               0.733942
                                                            True
2050
             1
                            Mexican_hairless
                                               0.330741
                                                            True
2051
             2
                                    Pembroke
                                               0.809197
                                                            True
```

```
2053
             1
                                       basset
                                               0.821664
                                                            True
2054
             1
                              French_bulldog
                                               0.995026
                                                            True
             2
                                     Pembroke
2055
                                               0.809197
                                                            True
             3
2056
                              Siberian_husky
                                               0.700377
                                                            True
             1
2057
                            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
             1
2062
                                     Pembroke
                                               0.966327
                                                            True
             1
2063
                              French_bulldog
                                               0.377417
                                                            True
             1
2064
                                      Samoyed
                                               0.957979
                                                             True
             1
2065
                                     Pembroke
                                               0.511319
                                                            True
2066
             1
                               Irish terrier
                                               0.487574
                                                             True
             2
2067
                                  Pomeranian
                                               0.566142
                                                            True
2068
             1
                                 Appenzeller
                                               0.341703
                                                            True
2069
             1
                   Chesapeake_Bay_retriever
                                                            True
                                               0.425595
2070
             2
                                       basset
                                               0.555712
                                                            True
2071
             1
                                 paper_towel
                                               0.170278
                                                           False
2072
             1
                                    Chihuahua
                                               0.716012
                                                            True
2073
             1
                                    Chihuahua
                                               0.323581
                                                            True
2074
             1
                                       orange
                                               0.097049
                                                           False
                              p2
                                   p2_conf
                                                                                 p3 \
                                             p2_dog
0
                          collie
                                  0.156665
                                               True
                                                                 Shetland_sheepdog
1
             miniature_pinscher
                                                               Rhodesian_ridgeback
                                  0.074192
                                                True
2
                        malinois
                                  0.138584
                                                True
                                                                        bloodhound
3
                                  0.360687
                         redbone
                                                True
                                                                miniature_pinscher
4
                     Rottweiler
                                  0.243682
                                                True
                                                                           Doberman
5
                                                True
                                                       Greater_Swiss_Mountain_dog
               English_springer
                                  0.263788
6
                     mud_turtle
                                  0.045885
                                              False
                                                                           terrapin
7
                Tibetan_mastiff
                                  0.058279
                                               True
                                                                           fur_coat
8
                                              False
                shopping_basket
                                  0.014594
                                                                  golden_retriever
9
                        komondor
                                  0.192305
                                               True
                                                      soft-coated_wheaten_terrier
                                  0.093718
10
                Tibetan_mastiff
                                               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
                                                                    Dandie_Dinmont
                        Shih-Tzu
                                  0.166192
                                               True
16
                   Newfoundland
                                  0.149842
                                               True
                                                                             borzoi
17
                                  0.033919
                                              False
                            cock
                                                                         partridge
                                              False
18
                            desk
                                  0.085547
                                                                           bookcase
19
                    toy_terrier
                                  0.111884
                                               True
                                                                            basenji
                                  0.063064
20
                     toy_poodle
                                               True
                                                                  miniature_poodle
21
                           otter
                                  0.015250
                                              False
                                                                    great_grey_owl
22
                   Newfoundland
                                  0.278407
                                               True
                                                                       groenendael
```

limousine

0.130432

False

2052

1

```
23
      Chesapeake_Bay_retriever
                                  0.054787
                                               True
                                                                Labrador_retriever
24
                 Siberian_husky
                                  0.147655
                                               True
                                                                        Eskimo_dog
25
                           skunk
                                  0.002402
                                              False
                                                                           hamster
26
                   Afghan_hound
                                  0.259551
                                               True
                                                                             briard
27
                    toy_terrier
                                  0.009397
                                               True
                                                                          papillon
28
                                  0.244220
                                               True
                     bloodhound
                                                            flat-coated_retriever
29
                     barracouta
                                  0.271485
                                              False
                                                                                gar
                                                 . . .
. . .
                                        . . .
                                                                                . . .
2045
                                  0.000361
                      Chihuahua
                                               True
                                                                       Boston_bull
2046
                     sports_car
                                  0.139952
                                              False
                                                                         car_wheel
2047
                 Great_Pyrenees
                                  0.186136
                                               True
                                                                    Dandie_Dinmont
                    toy_terrier
                                               True
2048
                                  0.143528
                                                                        can_opener
2049
                     Eskimo_dog
                                  0.035029
                                               True
                                                        Staffordshire_bullterrier
2050
                                              False
                        sea_lion
                                  0.275645
                                                                        Weimaraner
2051
           Rhodesian_ridgeback
                                  0.054950
                                               True
                                                                             beagle
                      tow_truck
2052
                                  0.029175
                                              False
                                                                     shopping_cart
2053
                        redbone
                                  0.087582
                                               True
                                                                        Weimaraner
2054
                                  0.000932
                                               True
                                                                      bull_mastiff
                             pug
2055
           Rhodesian_ridgeback
                                  0.054950
                                               True
                                                                             beagle
2056
                     Eskimo_dog
                                  0.166511
                                               True
                                                                          malamute
2057
            Labrador_retriever
                                  0.184172
                                               True
                                                                    English_setter
                Tibetan_mastiff
                                  0.120184
                                               True
                                                                Labrador_retriever
2058
2059
                          borzoi
                                  0.194742
                                               True
                                                                             Saluki
2060
            Labrador_retriever
                                  0.013834
                                               True
                                                                            redbone
2061
                                  0.002129
                                               True
                                                        Staffordshire_bullterrier
                           boxer
2062
                       Cardigan
                                  0.027356
                                               True
                                                                            basenji
2063
            Labrador_retriever
                                               True
                                                                             muzzle
                                  0.151317
                                               True
2064
                     Pomeranian
                                  0.013884
                                                                               chow
2065
                       Cardigan
                                  0.451038
                                               True
                                                                         Chihuahua
2066
                   Irish_setter
                                  0.193054
                                               True
                                                         Chesapeake_Bay_retriever
2067
                     Eskimo_dog
                                  0.178406
                                               True
                                                                          Pembroke
2068
                  Border_collie
                                  0.199287
                                               True
                                                                         ice_lolly
2069
                  Irish_terrier
                                  0.116317
                                               True
                                                                   Indian_elephant
2070
               English_springer
                                  0.225770
                                                      German_short-haired_pointer
                                               True
            Labrador_retriever
                                               True
2071
                                  0.168086
                                                                            spatula
2072
                       malamute
                                  0.078253
                                               True
                                                                            kelpie
                                  0.090647
                                               True
                                                                          papillon
2073
                       Pekinese
2074
                                  0.085851
                                              False
                                                                             banana
                           bagel
       p3_conf
                 p3_dog
0
      0.061428
                   True
1
      0.072010
                   True
2
      0.116197
                   True
3
                   True
      0.222752
4
                   True
      0.154629
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
24	0.093412	True
25	0.000461	False
26	0.206803	True
27	0.004577	True
28	0.173810	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
2054	0.000903	True
2055	0.038915	True
2056	0.111411	True
2057	0.073482	True
2058	0.105506	True
2059	0.027351	True
2060	0.007958	True
2061	0.001498	True
2062	0.004633	True
2063	0.082981	False
2064	0.008167	True
2065	0.029248	True
2066	0.118184	True
2067	0.076507	True
2068	0.193548	False
2069	0.076902	False

```
2070 0.175219
                           True
                          False
         2071 0.040836
         2072 0.031379
                           True
         2073 0.068957
                           True
         2074 0.076110
                          False
         [2075 rows x 12 columns]
In [15]: # Get Data info
         image.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2075 entries, 0 to 2074
Data columns (total 12 columns):
            2075 non-null int64
tweet_id
            2075 non-null object
jpg_url
            2075 non-null int64
img_num
            2075 non-null object
р1
            2075 non-null float64
p1_conf
p1_dog
            2075 non-null bool
            2075 non-null object
p2
p2_conf
            2075 non-null float64
            2075 non-null bool
p2_dog
            2075 non-null object
рЗ
p3_conf
            2075 non-null float64
            2075 non-null bool
p3_dog
dtypes: bool(3), float64(3), int64(2), object(4)
memory usage: 152.1+ KB
In [16]: # Get summary of our quantative data
         image describe()
Out[16]:
                    tweet_id
                                  img_num
                                                p1_conf
                                                              p2_conf
                                                                            p3_conf
         count
                2.075000e+03
                              2075.000000
                                            2075.000000
                                                         2.075000e+03 2.075000e+03
                7.384514e+17
                                 1.203855
                                              0.594548 1.345886e-01
                                                                       6.032417e-02
         mean
                6.785203e+16
                                              0.271174 1.006657e-01
                                                                       5.090593e-02
         std
                                 0.561875
                                              0.044333 1.011300e-08 1.740170e-10
         min
                6.660209e+17
                                 1.000000
         25%
                                              0.364412 5.388625e-02 1.622240e-02
                6.764835e+17
                                 1.000000
         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
                8.924206e+17
                                 4.000000
                                              1.000000 4.880140e-01 2.734190e-01
         max
In [17]: twitter_api
Out[17]:
                                                       coordinates
                                        contributors
                                                                            created_at \
         1991-02-08 13:48:08.022790149
                                                 NaN
                                                               NaN 2015-11-15 22:32:08
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                                  <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-09 07:01:56.733198337
1991-02-09 10:06:40.022159362
                                  <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-09 11:38:33.787052032
                                  <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-09 12:22:35.909144576
                                  <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-09 12:55:33.288665088
                                  <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-11 10:41:50.803644416
                                  <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-11 11:51:37.616637952
                                  <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-11 15:50:06.224695296
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                                  <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-11 17:38:31.632134144
                                  <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-12 05:51:22.303524864
1991-02-12 07:56:57.576210432
                                  <a href="http://twitter.com/download/iphone" r...</pre>
                                  <a href="http://twitter.com/download/iphone" r...</pre>
1991-02-12 10:08:08.456101888
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1991-02-12 12:45:58.909284353
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1991-02-12 22:04:07.373291520
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1991-02-13 02:18:27.551481857
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1998-02-01 20:49:04.734445568
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1998-02-09 00:13:53.522544640
1998-02-10 09:03:12.804085760
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1998-02-13 04:13:37.045368832
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1998-03-11 17:53:57.579907072
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1998-03-14 13:08:16.479866881
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1998-03-16 00:03:28.113172480
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1998-03-18 16:57:35.349198849
1998-03-22 23:26:25.150312448
                                  <a href="http://twitter.com/download/iphone" r...</pre>
1998-03-24 08:46:21.411237888
                                  <a href="http://twitter.com/download/iphone" r...</pre>
1998-03-27 04:11:53.173991426
                                  <a href="http://twitter.com/download/iphone" r...</pre>
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1998-03-28 12:25:50.875897856
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1998-03-31 06:59:18.926688256
1998-04-04 11:32:37.279858688
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1998-04-05 22:26:21.378084864
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1998-04-10 03:03:41.306343426
                                  <a href="http://twitter.com/download/iphone" r...</pre>
```

text \

```
1991-02-08 13:48:08.022790149
                               Here we have a Japanese Irish Setter. Lost eye...
1991-02-08 16:08:05.002620928
                               This is a western brown Mitsubishi terrier. Up...
                               Here is a very happy pup. Big fan of well-main...
1991-02-08 17:16:52.701032449
1991-02-08 20:17:06.329800704
                               This is a purebred Piers Morgan. Loves to Netf...
1991-02-08 21:40:48.165822465
                               Here we have a 1949 1st generation vulpix. Enj...
1991-02-08 22:05:58.794694657
                               This is a truly beautiful English Wilson Staff...
1991-02-08 22:24:13.826850816
                               This is an odd dog. Hard on the outside but lo...
1991-02-08 23:25:25.042405380
                               Here is a Siberian heavily armored polar bear ...
1991-02-08 23:51:30.499244032
                               My oh my. This is a rare blond Canadian terrie...
                               Here is the Rand Paul of retrievers folks! He' ...
1991-02-09 00:16:40.524156928
1991-02-09 01:43:47.256086533
                               This is the happiest dog you will ever see. Ve...
1991-02-09 03:46:33.221509120
                               Here we have a northern speckled Rhododendron...
                               Let's hope this flight isn't Malaysian (lol). ...
1991-02-09 04:18:20.786774016
1991-02-09 07:01:56.733198337
                               Here we have a well-established sunblockerspan...
1991-02-09 10:06:40.022159362
                               This appears to be a Mongolian Presbyterian mi...
1991-02-09 11:38:33.787052032
                               Can stand on stump for what seems like a while...
1991-02-09 12:22:35.909144576
                               Oh my. Here you are seeing an Adobe Setter giv...
                               Not familiar with this breed. No tail (weird)...
1991-02-09 12:55:33.288665088
1991-02-11 10:41:50.803644416
                               Very concerned about fellow dog trapped in com...
1991-02-11 11:51:37.616637952
                                  Can take selfies 11/10 https://t.co/ws2AMaNwPW
                               This is an Albanian 3 1/2 legged Episcopalian...
1991-02-11 15:50:06.224695296
1991-02-11 17:38:31.632134144
                               This is a funny dog. Weird toes. Won't come do...
1991-02-12 05:51:22.303524864
                               This is an extremely rare horned Parthenon. No...
1991-02-12 07:56:57.576210432
                               Look at this jokester thinking seat belt laws ...
1991-02-12 10:08:08.456101888
                               Here we have a mixed Asiago from the Galápagos...
                               Unique dog here. Very small. Lives in containe...
1991-02-12 12:45:58.909284353
1991-02-12 15:49:13.744588802
                               Those are sunglasses and a jean jacket. 11/10 ...
1991-02-12 22:04:07.373291520
                               Oh goodness. A super rare northeast Qdoba kang...
1991-02-13 01:05:26.856765440
                               This is a southern Vesuvius bumblegruff. Can d...
1991-02-13 02:18:27.551481857
                               This is quite the dog. Gets really excited whe...
1998-01-31 17:16:49.285017600
                               @NonWhiteHat @MayhewMayhem omg hello tanner yo...
1998-02-01 20:49:04.734445568
                               This is Roscoe. Another pupper fallen victim t...
1998-02-05 12:05:36.477933568
                               This is Derek. He's late for a dog meeting. 13...
1998-02-06 03:48:00.519319552
                               This is Mingus. He's a wonderful father to his...
1998-02-09 00:13:53.522544640
                               This is Maya. She's very shy. Rarely leaves he...
1998-02-10 09:03:12.804085760
                               This... is a Jubilant Antarctic House Bear. We...
1998-02-13 04:13:37.045368832
                               You may not have known you needed to see this ...
1998-02-14 16:32:37.103951883
                               This is Canela. She attempted some fancy porch...
1998-02-15 04:32:19.158093824
                               I've yet to rate a Venezuelan Hover Wiener. Th...
1998-02-17 08:48:09.381826560
                               This is Jeffrey. He has a monopoly on the pool...
1998-02-21 16:27:14.458587136
                               This is Gerald. He was just told he didn't get...
                               This is Ralphus. He's powering up. Attempting ...
1998-02-27 04:49:22.724278272
1998-03-02 02:16:29.199671297
                               This is Zeke. He has a new stick. Very proud o...
1998-03-03 09:27:18.123831296
                               This is Jim. He found a fren. Taught him how t...
```

```
1998-03-07 13:54:01.981685760
                               This is Oliver. You're witnessing one of his m...
                               This is Stuart. He's sporting his favorite fan...
1998-03-10 11:58:55.344209921
1998-03-11 17:53:57.579907072
                               This is Ted. He does his best. Sometimes that'...
1998-03-12 01:16:28.333682689
                               Here's a puppo that seems to be on the fence a...
                               This is Bruno. He is a service shark. Only get...
1998-03-14 13:08:16.479866881
1998-03-16 00:03:28.113172480
                               This is Koda. He is a South Australian decksha...
1998-03-18 16:57:35.349198849
                               This is Cassie. She is a college pup. Studying...
1998-03-22 23:26:25.150312448
                               This is Zoey. She doesn't want to be one of th...
                               When you watch your owner call another dog a g...
1998-03-24 08:46:21.411237888
1998-03-27 04:11:53.173991426
                               Meet Jax. He enjoys ice cream so much he gets ...
1998-03-28 12:25:50.875897856
                               Here we have a majestic great white breaching ...
1998-03-31 06:59:18.926688256
                               This is Franklin. He would like you to stop ca...
1998-04-04 11:32:37.279858688
                               This is Darla. She commenced a snooze mid meal...
1998-04-05 22:26:21.378084864
                               This is Archie. He is a rare Norwegian Pouncin...
1998-04-10 03:03:41.306343426
                               This is Tilly. She's just checking pup on you...
1998-04-12 22:37:23.555336193
                               This is Phineas. He's a mystical boy. Only eve...
```

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NaN

NaN

NaN

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12382.293537

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0.0 NaN

0.0 NaN

mean

std

min

NaN

NaN

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50%
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                 NaN
                               NaN
max
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                             id_str
                                      in_reply_to_status_id
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                      2.342000e+03
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count
mean
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                      7.986971e+17
                                               8.233264e+17
       8.924206e+17
                      8.924206e+17
                                               8.862664e+17
max
                                     in_reply_to_user_id
       in_reply_to_status_id_str
count
                     7.700000e+01
                                            7.700000e+01
                     7.440692e+17
                                            2.040329e+16
mean
                                            1.260797e+17
                     7.524295e+16
std
                     6.658147e+17
                                            1.185634e+07
min
                                            3.589728e+08
25%
                     6.757073e+17
50%
                     7.032559e+17
                                            4.196984e+09
75%
                     8.233264e+17
                                            4.196984e+09
                     8.862664e+17
                                            8.405479e+17
max
                                                     possibly_sensitive
       in_reply_to_user_id_str
                                   is_quote_status
                   7.700000e+01
                                       2342.000000
                                                                  2206.0
count
mean
                   2.040329e+16
                                          0.013237
                                                                     0.0
                   1.260797e+17
std
                                          0.114311
                                                                     0.0
                   1.185634e+07
                                          0.000000
                                                                     0.0
min
25%
                   3.589728e+08
                                                                     0.0
                                          0.000000
                   4.196984e+09
50%
                                          0.000000
                                                                     0.0
75%
                   4.196984e+09
                                          0.000000
                                                                     0.0
                   8.405479e+17
                                          1.000000
                                                                     0.0
max
       possibly_sensitive_appealable
                                         quoted_status_id
                                                            quoted_status_id_str
                                2206.0
                                             2.600000e+01
                                                                     2.600000e+01
count
                                    0.0
                                             8.113972e+17
                                                                     8.113972e+17
mean
                                    0.0
std
                                             6.295843e+16
                                                                     6.295843e+16
                                   0.0
                                             6.721083e+17
                                                                     6.721083e+17
min
25%
                                   0.0
                                             7.761338e+17
                                                                     7.761338e+17
50%
                                                                     8.281173e+17
                                   0.0
                                             8.281173e+17
75%
                                    0.0
                                             8.637581e+17
                                                                     8.637581e+17
                                                                     8.860534e+17
max
                                    0.0
                                             8.860534e+17
       retweet_count
                       retweeted
                                      truncated
         2342.000000
                           2342.0
                                    2342.000000
count
         2950.495303
                              0.0
                                       0.105465
mean
```

std	4962.148408	0.0	0.307218
min	0.000000	0.0	0.00000
25%	592.500000	0.0	0.000000
50%	1377.000000	0.0	0.000000
75%	3442.250000	0.0	0.000000
max	84082.000000	0.0	1.000000

Quality twitter_archive

- As per project instructions, we need to exclude 181 retweets from our table
- Name column has got incosistent value and NA need to be removed
- Rating numerator and denominator inconsistent values to be corrected
- Timestamp format to be datetime format. Then split it into three columns year, month, and day
- One thing more I found out I needed to do, make sure that "None" in dogs stages is programmable

image

- Drop records with duplicated jpg_url
- p1,p2 and p3 have inconsisitent upper case
- Replace underscore by space in p1, p2, p3 values
- Create one column for immage prediction and one column for confidence level

twitter_api

- Rename the id column to tweet id
- 168 records have a retweeted status which will need to be excluded

2.2.3 Tidiness

twitter_archive - Combine each dog stage column into a single column named "stage" - Convert Rating columns to float values - Remove columns that are not needed - All datasets

All datasets - All datasets Convert tweet_id column from an integer to a string value - Consolidate the 3 datasets into 1

2.2.4 Cleaning Data

twitter_archive dataset

Define Retweets are not original tweets and need to be removed

```
In [21]: # drop retweets values so they don't count
twitter_archive_clean.drop(twitter_archive_clean[twitter_archive_clean.retweeted_status
```

Test

In [22]: twitter_archive_clean.info()

twitter_archive_clean. shape

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2175 entries, 0 to 2355
Data columns (total 17 columns):
                              2175 non-null int64
tweet_id
in_reply_to_status_id
                              78 non-null float64
in_reply_to_user_id
                              78 non-null float64
                              2175 non-null object
timestamp
                              2175 non-null object
source
                              2175 non-null object
text
retweeted_status_id
                              0 non-null float64
                              O non-null float64
retweeted_status_user_id
                              O non-null object
retweeted_status_timestamp
                              2117 non-null object
expanded_urls
                              2175 non-null int64
rating_numerator
rating_denominator
                              2175 non-null int64
name
                              2175 non-null object
                              2175 non-null object
doggo
                              2175 non-null object
floofer
                              2175 non-null object
pupper
                              2175 non-null object
puppo
dtypes: float64(4), int64(3), object(10)
memory usage: 305.9+ KB
Out[22]: (2175, 17)
Define Remove all retweet related columns
Code
In [23]: # Remove retweets related columns
         twitter_archive_clean.drop(['retweeted_status_id', 'retweeted_status_user_id', 'retweeted
Test
In [24]: twitter_archive_clean.info()
         twitter_archive_clean. shape
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2175 entries, 0 to 2355
Data columns (total 14 columns):
                         2175 non-null int64
tweet_id
in_reply_to_status_id
                         78 non-null float64
in_reply_to_user_id
                         78 non-null float64
```

```
2175 non-null object
timestamp
source
                         2175 non-null object
                         2175 non-null object
text
                         2117 non-null object
expanded_urls
                         2175 non-null int64
rating_numerator
rating_denominator
                         2175 non-null int64
                         2175 non-null object
name
doggo
                         2175 non-null object
                         2175 non-null object
floofer
pupper
                         2175 non-null object
                         2175 non-null object
puppo
dtypes: float64(2), int64(3), object(9)
memory usage: 254.9+ KB
```

Out[24]: (2175, 14)

Define Name change to be verified

```
Out[25]: array(['Phineas', 'Tilly', 'Archie', 'Darla', 'Franklin', 'None', 'Jax',
                'Zoey', 'Cassie', 'Koda', 'Bruno', 'Ted', 'Stuart', 'Oliver', 'Jim',
                'Zeke', 'Ralphus', 'Gerald', 'Jeffrey', 'such', 'Canela', 'Maya',
                'Mingus', 'Derek', 'Roscoe', 'Waffles', 'Jimbo', 'Maisey', 'Earl',
                'Lola', 'Kevin', 'Yogi', 'Noah', 'Bella', 'Grizzwald', 'Rusty',
                'Gus', 'Stanley', 'Alfy', 'Koko', 'Rey', 'Gary', 'a', 'Elliot',
                'Louis', 'Jesse', 'Romeo', 'Bailey', 'Duddles', 'Jack', 'Steven',
                'Beau', 'Snoopy', 'Shadow', 'Emmy', 'Aja', 'Penny', 'Dante',
                'Nelly', 'Ginger', 'Benedict', 'Venti', 'Goose', 'Nugget', 'Cash',
                'Jed', 'Sebastian', 'Sierra', 'Monkey', 'Harry', 'Kody', 'Lassie',
                'Rover', 'Napolean', 'Boomer', 'Cody', 'Rumble', 'Clifford',
                'Dewey', 'Scout', 'Gizmo', 'Walter', 'Cooper', 'Harold', 'Shikha',
                'Lili', 'Jamesy', 'Coco', 'Sammy', 'Meatball', 'Paisley', 'Albus',
                'Neptune', 'Belle', 'Quinn', 'Zooey', 'Dave', 'Jersey', 'Hobbes',
                'Burt', 'Lorenzo', 'Carl', 'Jordy', 'Milky', 'Trooper', 'quite',
                'Sophie', 'Wyatt', 'Rosie', 'Thor', 'Oscar', 'Callie', 'Cermet',
                'Marlee', 'Arya', 'Einstein', 'Alice', 'Rumpole', 'Benny', 'Aspen',
                'Jarod', 'Wiggles', 'General', 'Sailor', 'Iggy', 'Snoop', 'Kyle',
                'Leo', 'Riley', 'Noosh', 'Odin', 'Jerry', 'Georgie', 'Rontu',
                'Cannon', 'Furzey', 'Daisy', 'Tuck', 'Barney', 'Vixen', 'Jarvis',
                'Mimosa', 'Pickles', 'Brady', 'Luna', 'Charlie', 'Margo', 'Sadie',
                'Hank', 'Tycho', 'Indie', 'Winnie', 'George', 'Bentley', 'Max',
                'Dawn', 'Maddie', 'Monty', 'Sojourner', 'Winston', 'Odie', 'Arlo',
                'Vincent', 'Lucy', 'Clark', 'Mookie', 'Meera', 'Ava', 'Eli', 'Ash',
```

```
'Tucker', 'Tobi', 'Chester', 'Wilson', 'Sunshine', 'Lipton',
'Bronte', 'Poppy', 'Gidget', 'Rhino', 'Willow', 'not', 'Orion',
'Eevee', 'Smiley', 'Miguel', 'Emanuel', 'Kuyu', 'Dutch', 'Pete',
'Scooter', 'Reggie', 'Lilly', 'Samson', 'Mia', 'Astrid', 'Malcolm',
'Dexter', 'Alfie', 'Fiona', 'one', 'Mutt', 'Bear', 'Doobert',
'Beebop', 'Alexander', 'Sailer', 'Brutus', 'Kona', 'Boots',
'Ralphie', 'Loki', 'Cupid', 'Pawnd', 'Pilot', 'Ike', 'Mo', 'Toby',
'Sweet', 'Pablo', 'Nala', 'Crawford', 'Gabe', 'Jimison', 'Duchess',
'Harlso', 'Sundance', 'Luca', 'Flash', 'Sunny', 'Howie', 'Jazzy',
'Anna', 'Finn', 'Bo', 'Wafer', 'Tom', 'Florence', 'Autumn', 'Buddy',
'Dido', 'Eugene', 'Ken', 'Strudel', 'Tebow', 'Chloe', 'Timber',
'Binky', 'Moose', 'Dudley', 'Comet', 'Akumi', 'Titan', 'Olivia',
'Alf', 'Oshie', 'Chubbs', 'Sky', 'Atlas', 'Eleanor', 'Layla',
'Rocky', 'Baron', 'Tyr', 'Bauer', 'Swagger', 'Brandi', 'Mary',
'Moe', 'Halo', 'Augie', 'Craig', 'Sam', 'Hunter', 'Pavlov', 'Phil',
'Kyro', 'Wallace', 'Ito', 'Seamus', 'Ollie', 'Stephan', 'Lennon',
'incredibly', 'Major', 'Duke', 'Sansa', 'Shooter', 'Django',
'Diogi', 'Sonny', 'Marley', 'Severus', 'Ronnie', 'Milo', 'Bones',
'Mauve', 'Chef', 'Doc', 'Peaches', 'Sobe', 'Longfellow', 'Mister',
'Iroh', 'Pancake', 'Snicku', 'Ruby', 'Brody', 'Mack', 'Nimbus',
'Laika', 'Maximus', 'Dobby', 'Moreton', 'Juno', 'Maude', 'Lily',
'Newt', 'Benji', 'Nida', 'Robin', 'Monster', 'BeBe', 'Remus',
'Levi', 'Mabel', 'Misty', 'Betty', 'Mosby', 'Maggie', 'Bruce',
'Happy', 'Ralphy', 'Brownie', 'Rizzy', 'Stella', 'Butter', 'Frank',
'Tonks', 'Lincoln', 'Rory', 'Logan', 'Dale', 'Rizzo', 'Arnie',
'Mattie', 'Pinot', 'Dallas', 'Hero', 'Frankie', 'Stormy',
'Reginald', 'Balto', 'Mairi', 'Loomis', 'Godi', 'Cali', 'Deacon',
'Timmy', 'Sampson', 'Chipson', 'Combo', 'Oakley', 'Dash',
'Hercules', 'Jay', 'Mya', 'Strider', 'Wesley', 'Solomon', 'Huck',
'O', 'Blue', 'Anakin', 'Finley', 'Sprinkles', 'Heinrich',
'Shakespeare', 'Chelsea', 'Bungalo', 'Chip', 'Grey', 'Roosevelt',
'Willem', 'Davey', 'Dakota', 'Fizz', 'Dixie', 'very', 'Al',
'Jackson', 'Carbon', 'Klein', 'DonDon', 'Kirby', 'Lou', 'Chevy',
'Tito', 'Philbert', 'Louie', 'Rupert', 'Rufus', 'Brudge', 'Shadoe',
'Angel', 'Brat', 'Tove', 'my', 'Gromit', 'Aubie', 'Kota', 'Leela',
'Glenn', 'Shelby', 'Sephie', 'Bonaparte', 'Albert', 'Wishes',
'Rose', 'Theo', 'Rocco', 'Fido', 'Emma', 'Spencer', 'Lilli',
'Boston', 'Brandonald', 'Corey', 'Leonard', 'Beckham', 'Devón',
'Gert', 'Watson', 'Keith', 'Dex', 'Ace', 'Tayzie', 'Grizzie',
'Fred', 'Gilbert', 'Meyer', 'Zoe', 'Stewie', 'Calvin', 'Lilah',
'Spanky', 'Jameson', 'Piper', 'Atticus', 'Blu', 'Dietrich',
'Divine', 'Tripp', 'his', 'Cora', 'Huxley', 'Keurig', 'Bookstore',
'Linus', 'Abby', 'Shiloh', 'an', 'Gustav', 'Arlen', 'Percy',
'Lenox', 'Sugar', 'Harvey', 'Blanket', 'actually', 'Geno', 'Stark',
'Beya', 'Kilo', 'Kayla', 'Maxaroni', 'Bell', 'Doug', 'Edmund',
'Aqua', 'Theodore', 'just', 'Baloo', 'Chase', 'getting', 'Nollie',
'Rorie', 'Simba', 'Charles', 'Bayley', 'Axel', 'Storkson', 'Remy',
'Chadrick', 'mad', 'Kellogg', 'Buckley', 'Livvie', 'Terry',
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'Hermione', 'Ralpher', 'Aldrick', 'Larry', 'this', 'unacceptable',
'Rooney', 'Crystal', 'Ziva', 'Stefan', 'Pupcasso', 'Puff',
'Flurpson', 'Coleman', 'Enchilada', 'Raymond', 'all', 'Rueben',
'Cilantro', 'Karll', 'Sprout', 'Blitz', 'Bloop', 'Colby', 'Lillie',
'Ashleigh', 'Kreggory', 'Sarge', 'Luther', 'Ivar', 'Jangle',
'Schnitzel', 'Panda', 'Berkeley', 'Ralphé', 'Charleson', 'Clyde',
'Harnold', 'Sid', 'Pippa', 'Otis', 'Carper', 'Bowie',
'Alexanderson', 'Suki', 'Barclay', 'Skittle', 'Ebby', 'Flávio',
'Smokey', 'Link', 'Jennifur', 'Ozzy', 'Bluebert', 'Stephanus',
'Bubbles', 'old', 'Zeus', 'Bertson', 'Nico', 'Michelangelope',
'Siba', 'Calbert', 'Curtis', 'Travis', 'Thumas', 'Kanu', 'Lance',
'Opie', 'Stubert', 'Kane', 'Olive', 'Chuckles', 'Staniel', 'Sora',
'Beemo', 'Gunner', 'infuriating', 'Lacy', 'Tater', 'Olaf', 'Cecil',
'Vince', 'Karma', 'Billy', 'Walker', 'Rodney', 'Klevin', 'Malikai',
'Bobble', 'River', 'Jebberson', 'Remington', 'Farfle', 'Jiminus',
'Harper', 'Clarkus', 'Finnegus', 'Cupcake', 'Kathmandu', 'Ellie',
'Katie', 'Kara', 'Adele', 'Zara', 'Ambrose', 'Jimothy', 'Bode',
'Terrenth', 'Reese', 'Chesterson', 'Lucia', 'Bisquick', 'Ralphson',
'Socks', 'Rambo', 'Rudy', 'Fiji', 'Rilo', 'Bilbo', 'Coopson',
'Yoda', 'Millie', 'Chet', 'Crouton', 'Daniel', 'Kaia', 'Murphy',
'Dotsy', 'Eazy', 'Coops', 'Fillup', 'Miley', 'Charl', 'Reagan',
'Yukon', 'CeCe', 'Cuddles', 'Claude', 'Jessiga', 'Carter', 'Ole',
'Pherb', 'Blipson', 'Reptar', 'Trevith', 'Berb', 'Bob', 'Colin',
'Brian', 'Oliviér', 'Grady', 'Kobe', 'Freddery', 'Bodie', 'Dunkin',
'Wally', 'Tupawc', 'Amber', 'Herschel', 'Edgar', 'Teddy',
'Kingsley', 'Brockly', 'Richie', 'Molly', 'Vinscent', 'Cedrick',
'Hazel', 'Lolo', 'Eriq', 'Phred', 'the', 'Oddie', 'Maxwell',
'Geoff', 'Covach', 'Durg', 'Fynn', 'Ricky', 'Herald', 'Lucky',
'Ferg', 'Trip', 'Clarence', 'Hamrick', 'Brad', 'Pubert', 'Fröng',
'Derby', 'Lizzie', 'Ember', 'Blakely', 'Opal', 'Marq', 'Kramer',
'Barry', 'Tyrone', 'Gordon', 'Baxter', 'Mona', 'Horace', 'Crimson',
'Birf', 'Hammond', 'Lorelei', 'Marty', 'Brooks', 'Petrick',
'Hubertson', 'Gerbald', 'Oreo', 'Bruiser', 'Perry', 'Bobby', 'Jeph',
'Obi', 'Tino', 'Kulet', 'Sweets', 'Lupe', 'Tiger', 'Jiminy',
'Griffin', 'Banjo', 'Brandy', 'Lulu', 'Darrel', 'Taco', 'Joey',
'Patrick', 'Kreg', 'Todo', 'Tess', 'Ulysses', 'Toffee', 'Apollo',
'Carly', 'Asher', 'Glacier', 'Chuck', 'Champ', 'Ozzie', 'Griswold',
'Cheesy', 'Moofasa', 'Hector', 'Goliath', 'Kawhi', 'by', 'Emmie',
'Penelope', 'Willie', 'Rinna', 'Mike', 'William', 'Dwight', 'Evy',
'Hurley', 'Rubio', 'officially', 'Chompsky', 'Rascal', 'Linda',
'Tug', 'Tango', 'Grizz', 'Jerome', 'Crumpet', 'Jessifer', 'Izzy',
'Ralph', 'Sandy', 'Humphrey', 'Tassy', 'Juckson', 'Chuq', 'Tyrus',
'Karl', 'Godzilla', 'Vinnie', 'Kenneth', 'Herm', 'Bert', 'Striker',
'Donny', 'Pepper', 'Bernie', 'Buddah', 'Lenny', 'Arnold', 'Zuzu',
'Mollie', 'Laela', 'Tedders', 'Superpup', 'Rufio', 'Jeb', 'Rodman',
'Jonah', 'Chesney', 'life', 'Kenny', 'Henry', 'Bobbay', 'Mitch',
'Kaiya', 'Acro', 'Aiden', 'Obie', 'Dot', 'Shnuggles', 'Kendall',
'Jeffri', 'Steve', 'Eve', 'Mac', 'Fletcher', 'Kenzie', 'Pumpkin',
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'Scott', 'Taz', 'Darby', 'Jackie', 'light', 'Jazz', 'Franq',
                'Pippin', 'Rolf', 'Snickers', 'Ridley', 'Cal', 'Bradley', 'Bubba',
                'Tuco', 'Patch', 'Mojo', 'Batdog', 'Dylan', 'space', 'Mark', 'JD',
                'Alejandro', 'Scruffers', 'Pip', 'Julius', 'Tanner', 'Sparky',
                'Anthony', 'Holly', 'Jett', 'Amy', 'Sage', 'Andy', 'Mason',
                'Trigger', 'Antony', 'Creg', 'Traviss', 'Gin', 'Jeffrie', 'Danny',
                'Ester', 'Pluto', 'Bloo', 'Edd', 'Paull', 'Willy', 'Herb', 'Damon',
                'Peanut', 'Nigel', 'Butters', 'Sandra', 'Fabio', 'Randall', 'Liam',
                'Tommy', 'Ben', 'Raphael', 'Julio', 'Andru', 'Kloey', 'Shawwn',
                'Skye', 'Kollin', 'Ronduh', 'Billl', 'Saydee', 'Dug', 'Tessa',
                'Sully', 'Kirk', 'Ralf', 'Clarg', 'Jaspers', 'Samsom', 'Terrance',
                'Harrison', 'Chaz', 'Jeremy', 'Jaycob', 'Lambeau', 'Ruffles',
                'Amélie', 'Bobb', 'Banditt', 'Kevon', 'Winifred', 'Hanz', 'Churlie',
                'Zeek', 'Timofy', 'Maks', 'Jomathan', 'Kallie', 'Marvin', 'Spark',
                'Gòrdón', 'Jo', 'DayZ', 'Jareld', 'Torque', 'Ron', 'Skittles',
                'Cleopatricia', 'Erik', 'Stu', 'Tedrick', 'Shaggy', 'Filup', 'Kial',
                'Naphaniel', 'Dook', 'Hall', 'Philippe', 'Biden', 'Fwed',
                'Genevieve', 'Joshwa', 'Timison', 'Bradlay', 'Pipsy', 'Clybe',
                'Keet', 'Carll', 'Jockson', 'Josep', 'Lugan', 'Christoper'], dtype=object)
In [26]: # Name consistency
         for name in twitter_archive_clean.name:
             if name.islower():
                 twitter_archive_clean.name.replace(name, 'None', inplace = True)
         twitter_archive_clean.name = twitter_archive_clean.name.replace('0', 'None')
Test
In [27]: twitter_archive_clean.name.unique()
Out[27]: array(['Phineas', 'Tilly', 'Archie', 'Darla', 'Franklin', 'None', 'Jax',
                'Zoey', 'Cassie', 'Koda', 'Bruno', 'Ted', 'Stuart', 'Oliver', 'Jim',
                'Zeke', 'Ralphus', 'Gerald', 'Jeffrey', 'Canela', 'Maya', 'Mingus',
                'Derek', 'Roscoe', 'Waffles', 'Jimbo', 'Maisey', 'Earl', 'Lola',
                'Kevin', 'Yogi', 'Noah', 'Bella', 'Grizzwald', 'Rusty', 'Gus',
                'Stanley', 'Alfy', 'Koko', 'Rey', 'Gary', 'Elliot', 'Louis',
                'Jesse', 'Romeo', 'Bailey', 'Duddles', 'Jack', 'Steven', 'Beau',
                'Snoopy', 'Shadow', 'Emmy', 'Aja', 'Penny', 'Dante', 'Nelly',
                'Ginger', 'Benedict', 'Venti', 'Goose', 'Nugget', 'Cash', 'Jed',
                'Sebastian', 'Sierra', 'Monkey', 'Harry', 'Kody', 'Lassie', 'Rover',
                'Napolean', 'Boomer', 'Cody', 'Rumble', 'Clifford', 'Dewey',
                'Scout', 'Gizmo', 'Walter', 'Cooper', 'Harold', 'Shikha', 'Lili',
                'Jamesy', 'Coco', 'Sammy', 'Meatball', 'Paisley', 'Albus',
                'Neptune', 'Belle', 'Quinn', 'Zooey', 'Dave', 'Jersey', 'Hobbes',
                'Burt', 'Lorenzo', 'Carl', 'Jordy', 'Milky', 'Trooper', 'Sophie',
                'Wyatt', 'Rosie', 'Thor', 'Oscar', 'Callie', 'Cermet', 'Marlee',
                'Arya', 'Einstein', 'Alice', 'Rumpole', 'Benny', 'Aspen', 'Jarod',
```

'Schnozz', 'Gustaf', 'Cheryl', 'Ed', 'Leonidas', 'Norman', 'Caryl',

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'Wiggles', 'General', 'Sailor', 'Iggy', 'Snoop', 'Kyle', 'Leo',
'Riley', 'Noosh', 'Odin', 'Jerry', 'Georgie', 'Rontu', 'Cannon',
'Furzey', 'Daisy', 'Tuck', 'Barney', 'Vixen', 'Jarvis', 'Mimosa',
'Pickles', 'Brady', 'Luna', 'Charlie', 'Margo', 'Sadie', 'Hank',
'Tycho', 'Indie', 'Winnie', 'George', 'Bentley', 'Max', 'Dawn',
'Maddie', 'Monty', 'Sojourner', 'Winston', 'Odie', 'Arlo',
'Vincent', 'Lucy', 'Clark', 'Mookie', 'Meera', 'Ava', 'Eli', 'Ash',
'Tucker', 'Tobi', 'Chester', 'Wilson', 'Sunshine', 'Lipton',
'Bronte', 'Poppy', 'Gidget', 'Rhino', 'Willow', 'Orion', 'Eevee',
'Smiley', 'Miguel', 'Emanuel', 'Kuyu', 'Dutch', 'Pete', 'Scooter',
'Reggie', 'Lilly', 'Samson', 'Mia', 'Astrid', 'Malcolm', 'Dexter',
'Alfie', 'Fiona', 'Mutt', 'Bear', 'Doobert', 'Beebop', 'Alexander',
'Sailer', 'Brutus', 'Kona', 'Boots', 'Ralphie', 'Loki', 'Cupid',
'Pawnd', 'Pilot', 'Ike', 'Mo', 'Toby', 'Sweet', 'Pablo', 'Nala',
'Crawford', 'Gabe', 'Jimison', 'Duchess', 'Harlso', 'Sundance',
'Luca', 'Flash', 'Sunny', 'Howie', 'Jazzy', 'Anna', 'Finn', 'Bo',
'Wafer', 'Tom', 'Florence', 'Autumn', 'Buddy', 'Dido', 'Eugene',
'Ken', 'Strudel', 'Tebow', 'Chloe', 'Timber', 'Binky', 'Moose',
'Dudley', 'Comet', 'Akumi', 'Titan', 'Olivia', 'Alf', 'Oshie',
'Chubbs', 'Sky', 'Atlas', 'Eleanor', 'Layla', 'Rocky', 'Baron',
'Tyr', 'Bauer', 'Swagger', 'Brandi', 'Mary', 'Moe', 'Halo', 'Augie',
'Craig', 'Sam', 'Hunter', 'Pavlov', 'Phil', 'Kyro', 'Wallace',
'Ito', 'Seamus', 'Ollie', 'Stephan', 'Lennon', 'Major', 'Duke',
'Sansa', 'Shooter', 'Django', 'Diogi', 'Sonny', 'Marley', 'Severus',
'Ronnie', 'Milo', 'Bones', 'Mauve', 'Chef', 'Doc', 'Peaches',
'Sobe', 'Longfellow', 'Mister', 'Iroh', 'Pancake', 'Snicku', 'Ruby',
'Brody', 'Mack', 'Nimbus', 'Laika', 'Maximus', 'Dobby', 'Moreton',
'Juno', 'Maude', 'Lily', 'Newt', 'Benji', 'Nida', 'Robin'.
'Monster', 'BeBe', 'Remus', 'Levi', 'Mabel', 'Misty', 'Betty',
'Mosby', 'Maggie', 'Bruce', 'Happy', 'Ralphy', 'Brownie', 'Rizzy',
'Stella', 'Butter', 'Frank', 'Tonks', 'Lincoln', 'Rory', 'Logan',
'Dale', 'Rizzo', 'Arnie', 'Mattie', 'Pinot', 'Dallas', 'Hero',
'Frankie', 'Stormy', 'Reginald', 'Balto', 'Mairi', 'Loomis', 'Godi',
'Cali', 'Deacon', 'Timmy', 'Sampson', 'Chipson', 'Combo', 'Oakley',
'Dash', 'Hercules', 'Jay', 'Mya', 'Strider', 'Wesley', 'Solomon',
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'Shakespeare', 'Chelsea', 'Bungalo', 'Chip', 'Grey', 'Roosevelt',
'Willem', 'Davey', 'Dakota', 'Fizz', 'Dixie', 'Al', 'Jackson',
'Carbon', 'Klein', 'DonDon', 'Kirby', 'Lou', 'Chevy', 'Tito',
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'Brat', 'Tove', 'Gromit', 'Aubie', 'Kota', 'Leela', 'Glenn',
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'Zoe', 'Stewie', 'Calvin', 'Lilah', 'Spanky', 'Jameson', 'Piper',
'Atticus', 'Blu', 'Dietrich', 'Divine', 'Tripp', 'Cora', 'Huxley',
'Keurig', 'Bookstore', 'Linus', 'Abby', 'Shiloh', 'Gustav', 'Arlen',
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'Percy', 'Lenox', 'Sugar', 'Harvey', 'Blanket', 'Geno', 'Stark',
'Beya', 'Kilo', 'Kayla', 'Maxaroni', 'Bell', 'Doug', 'Edmund',
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'Aldrick', 'Larry', 'Rooney', 'Crystal', 'Ziva', 'Stefan',
'Pupcasso', 'Puff', 'Flurpson', 'Coleman', 'Enchilada', 'Raymond',
'Rueben', 'Cilantro', 'Karll', 'Sprout', 'Blitz', 'Bloop', 'Colby',
'Lillie', 'Ashleigh', 'Kreggory', 'Sarge', 'Luther', 'Ivar',
'Jangle', 'Schnitzel', 'Panda', 'Berkeley', 'Ralphé', 'Charleson',
'Clyde', 'Harnold', 'Sid', 'Pippa', 'Otis', 'Carper', 'Bowie',
'Alexanderson', 'Suki', 'Barclay', 'Skittle', 'Ebby', 'Flávio',
'Smokey', 'Link', 'Jennifur', 'Ozzy', 'Bluebert', 'Stephanus',
'Bubbles', 'Zeus', 'Bertson', 'Nico', 'Michelangelope', 'Siba',
'Calbert', 'Curtis', 'Travis', 'Thumas', 'Kanu', 'Lance', 'Opie',
'Stubert', 'Kane', 'Olive', 'Chuckles', 'Staniel', 'Sora', 'Beemo',
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'Billy', 'Walker', 'Rodney', 'Klevin', 'Malikai', 'Bobble', 'River',
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'Finnegus', 'Cupcake', 'Kathmandu', 'Ellie', 'Katie', 'Kara',
'Adele', 'Zara', 'Ambrose', 'Jimothy', 'Bode', 'Terrenth', 'Reese',
'Chesterson', 'Lucia', 'Bisquick', 'Ralphson', 'Socks', 'Rambo',
'Rudy', 'Fiji', 'Rilo', 'Bilbo', 'Coopson', 'Yoda', 'Millie',
'Chet', 'Crouton', 'Daniel', 'Kaia', 'Murphy', 'Dotsy', 'Eazy',
'Coops', 'Fillup', 'Miley', 'Charl', 'Reagan', 'Yukon', 'CeCe',
'Cuddles', 'Claude', 'Jessiga', 'Carter', 'Ole', 'Pherb', 'Blipson',
'Reptar', 'Trevith', 'Berb', 'Bob', 'Colin', 'Brian', 'Oliviér',
'Grady', 'Kobe', 'Freddery', 'Bodie', 'Dunkin', 'Wally', 'Tupawc',
'Amber', 'Herschel', 'Edgar', 'Teddy', 'Kingsley', 'Brockly',
'Richie', 'Molly', 'Vinscent', 'Cedrick', 'Hazel', 'Lolo', 'Eriq',
'Phred', 'Oddie', 'Maxwell', 'Geoff', 'Covach', 'Durg', 'Fynn',
'Ricky', 'Herald', 'Lucky', 'Ferg', 'Trip', 'Clarence', 'Hamrick',
'Brad', 'Pubert', 'Frönq', 'Derby', 'Lizzie', 'Ember', 'Blakely',
'Opal', 'Marq', 'Kramer', 'Barry', 'Tyrone', 'Gordon', 'Baxter',
'Mona', 'Horace', 'Crimson', 'Birf', 'Hammond', 'Lorelei', 'Marty',
'Brooks', 'Petrick', 'Hubertson', 'Gerbald', 'Oreo', 'Bruiser',
'Perry', 'Bobby', 'Jeph', 'Obi', 'Tino', 'Kulet', 'Sweets', 'Lupe',
'Tiger', 'Jiminy', 'Griffin', 'Banjo', 'Brandy', 'Lulu', 'Darrel',
'Taco', 'Joey', 'Patrick', 'Kreg', 'Todo', 'Tess', 'Ulysses',
'Toffee', 'Apollo', 'Carly', 'Asher', 'Glacier', 'Chuck', 'Champ',
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'Kawhi', 'Emmie', 'Penelope', 'Willie', 'Rinna', 'Mike', 'William',
'Dwight', 'Evy', 'Hurley', 'Rubio', 'Chompsky', 'Rascal', 'Linda',
'Tug', 'Tango', 'Grizz', 'Jerome', 'Crumpet', 'Jessifer', 'Izzy',
'Ralph', 'Sandy', 'Humphrey', 'Tassy', 'Juckson', 'Chuq', 'Tyrus',
'Karl', 'Godzilla', 'Vinnie', 'Kenneth', 'Herm', 'Bert', 'Striker',
'Donny', 'Pepper', 'Bernie', 'Buddah', 'Lenny', 'Arnold', 'Zuzu',
'Mollie', 'Laela', 'Tedders', 'Superpup', 'Rufio', 'Jeb', 'Rodman',
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'Jonah', 'Chesney', 'Kenny', 'Henry', 'Bobbay', 'Mitch', 'Kaiya',
'Acro', 'Aiden', 'Obie', 'Dot', 'Shnuggles', 'Kendall', 'Jeffri',
'Steve', 'Eve', 'Mac', 'Fletcher', 'Kenzie', 'Pumpkin', 'Schnozz',
'Gustaf', 'Cheryl', 'Ed', 'Leonidas', 'Norman', 'Caryl', 'Scott',
'Taz', 'Darby', 'Jackie', 'Jazz', 'Frang', 'Pippin', 'Rolf',
'Snickers', 'Ridley', 'Cal', 'Bradley', 'Bubba', 'Tuco', 'Patch',
'Mojo', 'Batdog', 'Dylan', 'Mark', 'JD', 'Alejandro', 'Scruffers',
'Pip', 'Julius', 'Tanner', 'Sparky', 'Anthony', 'Holly', 'Jett',
'Amy', 'Sage', 'Andy', 'Mason', 'Trigger', 'Antony', 'Creg',
'Traviss', 'Gin', 'Jeffrie', 'Danny', 'Ester', 'Pluto', 'Bloo',
'Edd', 'Paull', 'Willy', 'Herb', 'Damon', 'Peanut', 'Nigel',
'Butters', 'Sandra', 'Fabio', 'Randall', 'Liam', 'Tommy', 'Ben',
'Raphael', 'Julio', 'Andru', 'Kloey', 'Shawwn', 'Skye', 'Kollin',
'Ronduh', 'Billl', 'Saydee', 'Dug', 'Tessa', 'Sully', 'Kirk',
'Ralf', 'Clarq', 'Jaspers', 'Samsom', 'Terrance', 'Harrison',
'Chaz', 'Jeremy', 'Jaycob', 'Lambeau', 'Ruffles', 'Amélie', 'Bobb',
'Banditt', 'Kevon', 'Winifred', 'Hanz', 'Churlie', 'Zeek', 'Timofy',
'Maks', 'Jomathan', 'Kallie', 'Marvin', 'Spark', 'Gòrdón', 'Jo',
'DayZ', 'Jareld', 'Torque', 'Ron', 'Skittles', 'Cleopatricia',
'Erik', 'Stu', 'Tedrick', 'Shaggy', 'Filup', 'Kial', 'Naphaniel',
'Dook', 'Hall', 'Philippe', 'Biden', 'Fwed', 'Genevieve', 'Joshwa',
'Timison', 'Bradlay', 'Pipsy', 'Clybe', 'Keet', 'Carll', 'Jockson',
'Josep', 'Lugan', 'Christoper'], dtype=object)
```

In [28]: twitter_archive_clean.name = twitter_archive_clean.name.apply(lambda x: x if x != 'None

Define Correct NA values in the name column

```
Test
In [29]: twitter_archive_clean.name.unique()
Out[29]: array(['Phineas', 'Tilly', 'Archie', 'Darla', 'Franklin', nan, 'Jax',
                'Zoey', 'Cassie', 'Koda', 'Bruno', 'Ted', 'Stuart', 'Oliver', 'Jim',
                'Zeke', 'Ralphus', 'Gerald', 'Jeffrey', 'Canela', 'Maya', 'Mingus',
                'Derek', 'Roscoe', 'Waffles', 'Jimbo', 'Maisey', 'Earl', 'Lola',
                'Kevin', 'Yogi', 'Noah', 'Bella', 'Grizzwald', 'Rusty', 'Gus',
                'Stanley', 'Alfy', 'Koko', 'Rey', 'Gary', 'Elliot', 'Louis',
                'Jesse', 'Romeo', 'Bailey', 'Duddles', 'Jack', 'Steven', 'Beau',
                'Snoopy', 'Shadow', 'Emmy', 'Aja', 'Penny', 'Dante', 'Nelly',
                'Ginger', 'Benedict', 'Venti', 'Goose', 'Nugget', 'Cash', 'Jed',
                'Sebastian', 'Sierra', 'Monkey', 'Harry', 'Kody', 'Lassie', 'Rover',
                'Napolean', 'Boomer', 'Cody', 'Rumble', 'Clifford', 'Dewey',
                'Scout', 'Gizmo', 'Walter', 'Cooper', 'Harold', 'Shikha', 'Lili',
                'Jamesy', 'Coco', 'Sammy', 'Meatball', 'Paisley', 'Albus',
                'Neptune', 'Belle', 'Quinn', 'Zooey', 'Dave', 'Jersey', 'Hobbes',
```

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'Burt', 'Lorenzo', 'Carl', 'Jordy', 'Milky', 'Trooper', 'Sophie',
'Wyatt', 'Rosie', 'Thor', 'Oscar', 'Callie', 'Cermet', 'Marlee',
'Arya', 'Einstein', 'Alice', 'Rumpole', 'Benny', 'Aspen', 'Jarod',
'Wiggles', 'General', 'Sailor', 'Iggy', 'Snoop', 'Kyle', 'Leo',
'Riley', 'Noosh', 'Odin', 'Jerry', 'Georgie', 'Rontu', 'Cannon',
'Furzey', 'Daisy', 'Tuck', 'Barney', 'Vixen', 'Jarvis', 'Mimosa',
'Pickles', 'Brady', 'Luna', 'Charlie', 'Margo', 'Sadie', 'Hank',
'Tycho', 'Indie', 'Winnie', 'George', 'Bentley', 'Max', 'Dawn',
'Maddie', 'Monty', 'Sojourner', 'Winston', 'Odie', 'Arlo',
'Vincent', 'Lucy', 'Clark', 'Mookie', 'Meera', 'Ava', 'Eli', 'Ash',
'Tucker', 'Tobi', 'Chester', 'Wilson', 'Sunshine', 'Lipton',
'Bronte', 'Poppy', 'Gidget', 'Rhino', 'Willow', 'Orion', 'Eevee',
'Smiley', 'Miguel', 'Emanuel', 'Kuyu', 'Dutch', 'Pete', 'Scooter',
'Reggie', 'Lilly', 'Samson', 'Mia', 'Astrid', 'Malcolm', 'Dexter',
'Alfie', 'Fiona', 'Mutt', 'Bear', 'Doobert', 'Beebop', 'Alexander',
'Sailer', 'Brutus', 'Kona', 'Boots', 'Ralphie', 'Loki', 'Cupid',
'Pawnd', 'Pilot', 'Ike', 'Mo', 'Toby', 'Sweet', 'Pablo', 'Nala',
'Crawford', 'Gabe', 'Jimison', 'Duchess', 'Harlso', 'Sundance',
'Luca', 'Flash', 'Sunny', 'Howie', 'Jazzy', 'Anna', 'Finn', 'Bo',
'Wafer', 'Tom', 'Florence', 'Autumn', 'Buddy', 'Dido', 'Eugene',
'Ken', 'Strudel', 'Tebow', 'Chloe', 'Timber', 'Binky', 'Moose',
'Dudley', 'Comet', 'Akumi', 'Titan', 'Olivia', 'Alf', 'Oshie',
'Chubbs', 'Sky', 'Atlas', 'Eleanor', 'Layla', 'Rocky', 'Baron',
'Tyr', 'Bauer', 'Swagger', 'Brandi', 'Mary', 'Moe', 'Halo', 'Augie',
'Craig', 'Sam', 'Hunter', 'Pavlov', 'Phil', 'Kyro', 'Wallace',
'Ito', 'Seamus', 'Ollie', 'Stephan', 'Lennon', 'Major', 'Duke',
'Sansa', 'Shooter', 'Django', 'Diogi', 'Sonny', 'Marley', 'Severus',
'Ronnie', 'Milo', 'Bones', 'Mauve', 'Chef', 'Doc', 'Peaches',
'Sobe', 'Longfellow', 'Mister', 'Iroh', 'Pancake', 'Snicku', 'Ruby',
'Brody', 'Mack', 'Nimbus', 'Laika', 'Maximus', 'Dobby', 'Moreton',
'Juno', 'Maude', 'Lily', 'Newt', 'Benji', 'Nida', 'Robin',
'Monster', 'BeBe', 'Remus', 'Levi', 'Mabel', 'Misty', 'Betty',
'Mosby', 'Maggie', 'Bruce', 'Happy', 'Ralphy', 'Brownie', 'Rizzy',
'Stella', 'Butter', 'Frank', 'Tonks', 'Lincoln', 'Rory', 'Logan',
'Dale', 'Rizzo', 'Arnie', 'Mattie', 'Pinot', 'Dallas', 'Hero',
'Frankie', 'Stormy', 'Reginald', 'Balto', 'Mairi', 'Loomis', 'Godi',
'Cali', 'Deacon', 'Timmy', 'Sampson', 'Chipson', 'Combo', 'Oakley',
'Dash', 'Hercules', 'Jay', 'Mya', 'Strider', 'Wesley', 'Solomon',
'Huck', 'Blue', 'Anakin', 'Finley', 'Sprinkles', 'Heinrich',
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'Willem', 'Davey', 'Dakota', 'Fizz', 'Dixie', 'Al', 'Jackson',
'Carbon', 'Klein', 'DonDon', 'Kirby', 'Lou', 'Chevy', 'Tito',
'Philbert', 'Louie', 'Rupert', 'Rufus', 'Brudge', 'Shadoe', 'Angel',
'Brat', 'Tove', 'Gromit', 'Aubie', 'Kota', 'Leela', 'Glenn',
'Shelby', 'Sephie', 'Bonaparte', 'Albert', 'Wishes', 'Rose', 'Theo',
'Rocco', 'Fido', 'Emma', 'Spencer', 'Lilli', 'Boston', 'Brandonald',
'Corey', 'Leonard', 'Beckham', 'Devón', 'Gert', 'Watson', 'Keith',
'Dex', 'Ace', 'Tayzie', 'Grizzie', 'Fred', 'Gilbert', 'Meyer',
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'Zoe', 'Stewie', 'Calvin', 'Lilah', 'Spanky', 'Jameson', 'Piper',
'Atticus', 'Blu', 'Dietrich', 'Divine', 'Tripp', 'Cora', 'Huxley',
'Keurig', 'Bookstore', 'Linus', 'Abby', 'Shiloh', 'Gustav', 'Arlen',
'Percy', 'Lenox', 'Sugar', 'Harvey', 'Blanket', 'Geno', 'Stark',
'Beya', 'Kilo', 'Kayla', 'Maxaroni', 'Bell', 'Doug', 'Edmund',
'Aqua', 'Theodore', 'Baloo', 'Chase', 'Nollie', 'Rorie', 'Simba',
'Charles', 'Bayley', 'Axel', 'Storkson', 'Remy', 'Chadrick',
'Kellogg', 'Buckley', 'Livvie', 'Terry', 'Hermione', 'Ralpher',
'Aldrick', 'Larry', 'Rooney', 'Crystal', 'Ziva', 'Stefan',
'Pupcasso', 'Puff', 'Flurpson', 'Coleman', 'Enchilada', 'Raymond',
'Rueben', 'Cilantro', 'Karll', 'Sprout', 'Blitz', 'Bloop', 'Colby',
'Lillie', 'Ashleigh', 'Kreggory', 'Sarge', 'Luther', 'Ivar',
'Jangle', 'Schnitzel', 'Panda', 'Berkeley', 'Ralphé', 'Charleson',
'Clyde', 'Harnold', 'Sid', 'Pippa', 'Otis', 'Carper', 'Bowie',
'Alexanderson', 'Suki', 'Barclay', 'Skittle', 'Ebby', 'Flávio',
'Smokey', 'Link', 'Jennifur', 'Ozzy', 'Bluebert', 'Stephanus',
'Bubbles', 'Zeus', 'Bertson', 'Nico', 'Michelangelope', 'Siba',
'Calbert', 'Curtis', 'Travis', 'Thumas', 'Kanu', 'Lance', 'Opie',
'Stubert', 'Kane', 'Olive', 'Chuckles', 'Staniel', 'Sora', 'Beemo',
'Gunner', 'Lacy', 'Tater', 'Olaf', 'Cecil', 'Vince', 'Karma',
'Billy', 'Walker', 'Rodney', 'Klevin', 'Malikai', 'Bobble', 'River',
'Jebberson', 'Remington', 'Farfle', 'Jiminus', 'Harper', 'Clarkus',
'Finnegus', 'Cupcake', 'Kathmandu', 'Ellie', 'Katie', 'Kara',
'Adele', 'Zara', 'Ambrose', 'Jimothy', 'Bode', 'Terrenth', 'Reese',
'Chesterson', 'Lucia', 'Bisquick', 'Ralphson', 'Socks', 'Rambo',
'Rudy', 'Fiji', 'Rilo', 'Bilbo', 'Coopson', 'Yoda', 'Millie',
'Chet', 'Crouton', 'Daniel', 'Kaia', 'Murphy', 'Dotsy', 'Eazy',
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'Reptar', 'Trevith', 'Berb', 'Bob', 'Colin', 'Brian', 'Oliviér',
'Grady', 'Kobe', 'Freddery', 'Bodie', 'Dunkin', 'Wally', 'Tupawc',
'Amber', 'Herschel', 'Edgar', 'Teddy', 'Kingsley', 'Brockly',
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'Phred', 'Oddie', 'Maxwell', 'Geoff', 'Covach', 'Durg', 'Fynn',
'Ricky', 'Herald', 'Lucky', 'Ferg', 'Trip', 'Clarence', 'Hamrick',
'Brad', 'Pubert', 'Frönq', 'Derby', 'Lizzie', 'Ember', 'Blakely',
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'Karl', 'Godzilla', 'Vinnie', 'Kenneth', 'Herm', 'Bert', 'Striker',
'Donny', 'Pepper', 'Bernie', 'Buddah', 'Lenny', 'Arnold', 'Zuzu',
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'Acro', 'Aiden', 'Obie', 'Dot', 'Shnuggles', 'Kendall', 'Jeffri',
'Steve', 'Eve', 'Mac', 'Fletcher', 'Kenzie', 'Pumpkin', 'Schnozz',
'Gustaf', 'Cheryl', 'Ed', 'Leonidas', 'Norman', 'Caryl', 'Scott',
'Taz', 'Darby', 'Jackie', 'Jazz', 'Franq', 'Pippin', 'Rolf',
'Snickers', 'Ridley', 'Cal', 'Bradley', 'Bubba', 'Tuco', 'Patch',
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'Pip', 'Julius', 'Tanner', 'Sparky', 'Anthony', 'Holly', 'Jett',
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'Erik', 'Stu', 'Tedrick', 'Shaggy', 'Filup', 'Kial', 'Naphaniel',
'Dook', 'Hall', 'Philippe', 'Biden', 'Fwed', 'Genevieve', 'Joshwa',
'Timison', 'Bradlay', 'Pipsy', 'Clybe', 'Keet', 'Carll', 'Jockson',
'Josep', 'Lugan', 'Christoper'], dtype=object)
```

Define Rating numerator and denominator from integer to decimal

Code

Test

```
In [31]: twitter_archive_clean.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2175 entries, 0 to 2355
Data columns (total 14 columns):
                         2175 non-null int64
tweet id
                         78 non-null float64
in_reply_to_status_id
in_reply_to_user_id
                         78 non-null float64
timestamp
                         2175 non-null object
                         2175 non-null object
source
text
                         2175 non-null object
                         2117 non-null object
expanded_urls
```

```
2175 non-null float64
rating_numerator
                         2175 non-null float64
rating_denominator
                         1390 non-null object
name
                         2175 non-null object
doggo
                         2175 non-null object
floofer
                         2175 non-null object
pupper
                         2175 non-null object
puppo
dtypes: float64(4), int64(1), object(9)
memory usage: 254.9+ KB
```

Define Timestamp coversion to datetime format then split into three columns year, month, and day

```
In [33]: list(twitter_archive_clean)
Out[33]: ['tweet_id',
          'in_reply_to_status_id',
          'in_reply_to_user_id',
          'source',
          'text',
          'expanded_urls',
          'rating_numerator',
          'rating_denominator',
          'name',
          'doggo',
          'floofer',
          'pupper',
          'puppo',
          'year',
          'month',
          'day']
```

```
image dataset
In [34]: image_clean = image.copy()
Define Drop duplicated records with same jpg_url
Code
In [35]: ## Duplicated jpq_url
         sum(image.jpg_url.duplicated())
Out[35]: 66
In [36]: image_clean = image_clean.drop_duplicates(subset=['jpg_url'], keep='last')
Test
In [37]: sum(image_clean['jpg_url'].duplicated())
Out[37]: 0
Define p1,p2 and p3 have inconsisitent upper case
In [38]: image_clean['p1'] = image_clean['p1'].str.lower()
         image_clean['p2'] = image_clean['p2'].str.lower()
         image_clean['p3'] = image_clean['p3'].str.lower()
```

Test

```
In [39]: image_clean.head(5)
Out [39]:
                      tweet_id
                                                                        jpg_url \
         O 666020888022790149 https://pbs.twimg.com/media/CT4udnOWwAAOaMy.jpg
         1 666029285002620928
                                https://pbs.twimg.com/media/CT42GRgUYAA5iDo.jpg
                                https://pbs.twimg.com/media/CT4521TWwAEvMyu.jpg
         2 666033412701032449
         3 666044226329800704
                                https://pbs.twimg.com/media/CT5Dr8HUEAA-1Eu.jpg
                                https://pbs.twimg.com/media/CT5IQmsXIAAKY4A.jpg
         4 666049248165822465
            img_num
                                         р1
                                              p1_conf p1_dog
                                                                               p2
         0
                     welsh_springer_spaniel
                  1
                                             0.465074
                                                         True
                                                                           collie
         1
                  1
                                    redbone
                                             0.506826
                                                         True
                                                              miniature_pinscher
         2
                  1
                            german_shepherd
                                             0.596461
                                                         True
                                                                         malinois
                  1
                        rhodesian_ridgeback
         3
                                             0.408143
                                                         True
                                                                          redbone
                  1
                         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
                        True rhodesian_ridgeback
                                                   0.072010
                                                               True
         2 0.138584
```

bloodhound

miniature_pinscher 0.222752

doberman 0.154629

True

True

True

0.116197

True

True

True

3 0.360687

4 0.243682

Define Replace underscore by space in p1, p2, p3 values

Code

```
In [40]: image_clean['p1'] = image_clean['p1'].str.replace('_', ' ')
         image_clean['p2'] = image_clean['p2'].str.replace('_', '')
         image_clean['p3'] = image_clean['p3'].str.replace('_', '')
Test
In [41]: image_clean.head(5)
Out[41]:
                     tweet id
                                                                       jpg_url \
        0 666020888022790149 https://pbs.twimg.com/media/CT4udn0WwAA0aMy.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
           img_num
                                             p1_conf p1_dog
                                                                              p2
        0
                    welsh springer spaniel 0.465074
                 1
                                                        True
                                                                          collie
         1
                 1
                                   redbone
                                            0.506826
                                                        True miniature pinscher
         2
                  1
                                            0.596461
                           german shepherd
                                                        True
                                                                        malinois
                       rhodesian ridgeback
                                                                         redbone
         3
                 1
                                            0.408143
                                                        True
                        miniature pinscher
                  1
                                            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
                       True rhodesian ridgeback 0.072010
                                                              True
         2 0.138584
                       True
                                      bloodhound 0.116197
                                                              True
         3 0.360687
                       True
                              miniature pinscher 0.222752
                                                              True
         4 0.243682
                                        doberman 0.154629
                       True
                                                              True
```

Define Create one column for immage prediction and one column for confidence level

```
dog_type.append(image_clean['p2'])
                 confidence_list.append(image_clean['p2_conf'])
             elif image_clean['p3_dog'] == True:
                 dog_type.append(image_clean['p3'])
                 confidence_list.append(image_clean['p3_conf'])
             else:
                 dog_type.append('Error')
                 confidence_list.append('Error')
         # series objects having index the image_prediction_clean column.
         image_clean.apply(image, axis=1)
         # create new columns
         image_clean['dog_type'] = dog_type
         image_clean['confidence_list'] = confidence_list
In [43]: #drop rows that has prediction_list 'error'
         image_clean = image_clean[image_clean['dog_type'] != 'Error']
Test
In [44]: image_clean.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 1691 entries, 0 to 2073
Data columns (total 14 columns):
tweet id
                  1691 non-null int64
jpg_url
                   1691 non-null object
img_num
                   1691 non-null int64
р1
                   1691 non-null object
                   1691 non-null float64
p1_conf
                   1691 non-null bool
p1_dog
                   1691 non-null object
р2
                   1691 non-null float64
p2_conf
p2_dog
                   1691 non-null bool
                   1691 non-null object
рЗ
                   1691 non-null float64
p3_conf
                   1691 non-null bool
p3_dog
                   1691 non-null object
dog_type
confidence_list
                   1691 non-null object
dtypes: bool(3), float64(3), int64(2), object(6)
memory usage: 163.5+ KB
twitter api
In [45]: twitter_api_clean = twitter_api.copy()
```

Define Rename the id column to tweet id

```
In [46]: twitter_api_clean.rename(columns = {'id': 'tweet_id'}, inplace = True)
Test
In [47]: list(twitter_api_clean)
Out[47]: ['contributors',
          'coordinates',
          'created_at',
          'entities',
          'extended_entities',
          'favorite_count',
          'favorited',
          'geo',
          'tweet_id',
          'id_str',
          'in_reply_to_screen_name',
          'in_reply_to_status_id',
          'in_reply_to_status_id_str',
          'in_reply_to_user_id',
          'in_reply_to_user_id_str',
          'is_quote_status',
          'lang',
          'place',
          'possibly_sensitive',
          'possibly_sensitive_appealable',
          'quoted_status',
          'quoted_status_id',
          'quoted_status_id_str',
          'retweet_count',
          'retweeted',
          'retweeted_status',
          'source',
          'text',
          'truncated',
          'user']
In [48]: twitter_api_clean.info()
<class 'pandas.core.frame.DataFrame'>
DatetimeIndex: 2342 entries, 1991-02-08 13:48:08.022790149 to 1998-04-12 22:37:23.555336193
Data columns (total 30 columns):
                                  O non-null float64
contributors
coordinates
                                  0 non-null float64
created_at
                                  2342 non-null datetime64[ns]
                                  2342 non-null object
entities
                                  1823 non-null object
extended_entities
```

```
2342 non-null int64
favorite_count
favorited
                                  2342 non-null int64
                                  O non-null float64
geo
                                  2342 non-null int64
tweet_id
id_str
                                  2342 non-null int64
in_reply_to_screen_name
                                  77 non-null object
in_reply_to_status_id
                                  77 non-null float64
in_reply_to_status_id_str
                                  77 non-null float64
in_reply_to_user_id
                                  77 non-null float64
in_reply_to_user_id_str
                                  77 non-null float64
                                  2342 non-null int64
is_quote_status
                                  2342 non-null object
lang
place
                                  1 non-null object
                                  2206 non-null float64
possibly_sensitive
possibly_sensitive_appealable
                                  2206 non-null float64
                                  24 non-null object
quoted_status
quoted_status_id
                                  26 non-null float64
quoted_status_id_str
                                  26 non-null float64
retweet_count
                                  2342 non-null int64
                                  2342 non-null int64
retweeted
retweeted_status
                                  168 non-null object
                                  2342 non-null object
source
text
                                  2342 non-null object
                                  2342 non-null int64
truncated
                                  2342 non-null object
user
dtypes: datetime64[ns](1), float64(11), int64(8), object(10)
memory usage: 567.2+ KB
```

Define 168 records have a retweeted_status which will need to be excluded

```
Out [49]:
                                         contributors
                                                       coordinates
                                                                             created_at \
         1991-02-26 06:48:02.905632768
                                                  NaN
                                                                NaN 2015-11-20 03:51:47
         1991-02-26 06:48:24.950915073
                                                                NaN 2015-11-20 03:51:52
                                                  NaN
         1992-07-24 17:26:49.858043904
                                                  NaN
                                                                NaN 2016-03-21 19:31:59
         1993-07-28 05:05:15.802583040
                                                                NaN 2016-06-17 16:01:16
                                                  NaN
         1993-08-28 07:04:05.350707200
                                                  NaN
                                                                NaN 2016-06-25 01:52:36
         1993-09-05 15:18:28.580548608
                                                                NaN 2016-06-27 01:37:04
                                                  NaN
         1993-11-03 06:49:54.570878976
                                                  NaN
                                                                NaN 2016-07-11 01:11:51
         1993-11-07 19:52:24.171524096
                                                  NaN
                                                                NaN 2016-07-12 03:11:42
         1993-11-14 17:37:14.498793472
                                                  NaN
                                                                NaN 2016-07-13 18:42:44
         1993-12-02 23:27:21.593970688
                                                  NaN
                                                                NaN 2016-07-18 03:06:01
         1994-01-03 11:51:44.299253760
                                                  NaN
                                                                NaN 2016-07-25 15:26:30
```

```
1994-01-05 00:19:23.776290825
                                                       NaN 2016-07-26 00:08:05
                                          NaN
1994-01-21 13:45:34.323924993
                                          NaN
                                                       NaN 2016-07-29 22:53:27
1994-01-26 06:47:08.574212096
                                                       NaN 2016-07-31 01:50:18
                                          NaN
1994-02-02 01:52:29.710192640
                                                       NaN 2016-08-01 16:43:19
                                          NaN
1994-02-16 03:57:17.149827077
                                          NaN
                                                       NaN 2016-08-05 01:19:35
1994-02-20 13:21:42.866649088
                                          NaN
                                                       NaN 2016-08-06 02:27:27
1994-03-08 22:51:03.695355904
                                          NaN
                                                       NaN 2016-08-10 00:16:21
1994-04-11 15:28:12.750233600
                                          NaN
                                                       NaN 2016-08-18 01:03:45
1994-04-20 17:54:21.642756096
                                                       NaN 2016-08-20 05:08:29
                                          NaN
1994-05-10 07:15:58.521745409
                                         {\tt NaN}
                                                       NaN 2016-08-24 21:02:45
1994-05-14 10:02:47.477751808
                                                       NaN 2016-08-25 20:35:48
                                          NaN
1994-05-19 08:19:51.808995329
                                          NaN
                                                       NaN 2016-08-27 00:47:53
1994-05-28 02:56:07.776997377
                                                       NaN 2016-08-29 03:00:36
                                          NaN
1994-06-07 15:53:14.259247104
                                          NaN
                                                       NaN 2016-08-31 15:19:06
1994-06-09 14:10:53.431250945
                                          NaN
                                                       NaN 2016-09-01 02:21:21
1994-06-26 07:22:04.260794368
                                                       NaN 2016-09-05 02:00:22
                                          NaN
1994-07-04 15:46:27.167145985
                                          NaN
                                                       NaN 2016-09-07 01:47:12
1994-08-03 07:24:21.951791106
                                                       NaN 2016-09-14 03:27:11
                                          {\tt NaN}
1994-08-07 08:58:26.839351296
                                                       NaN 2016-09-15 02:42:54
                                          NaN
                                          . . .
1996-09-04 10:46:33.020538882
                                          NaN
                                                       NaN 2017-03-15 02:10:39
1996-10-12 05:32:39.547420673
                                          NaN
                                                       NaN 2017-03-24 02:22:04
1996-11-14 11:39:34.464610304
                                          NaN
                                                       NaN 2017-04-01 00:39:12
1996-11-14 13:41:05.427394560
                                          NaN
                                                       NaN 2017-04-01 01:08:10
1996-12-04 02:54:54.696017920
                                                       NaN 2017-04-05 17:00:34
                                          NaN
1996-12-29 12:09:45.021730816
                                                       NaN 2017-04-11 18:15:55
                                          NaN
1996-12-30 13:51:42.622658560
                                                       NaN 2017-04-12 00:23:33
                                          {\tt NaN}
1997-01-10 22:46:45.516943360
                                          NaN
                                                       NaN 2017-04-14 17:27:40
                                                       NaN 2017-04-20 19:16:59
1997-02-05 10:24:01.867124737
                                          NaN
1997-02-06 16:08:43.840757760
                                                       NaN 2017-04-21 02:22:29
                                          NaN
1997-02-19 05:40:35.276025856
                                                       NaN 2017-04-24 02:15:55
                                          NaN
1997-02-22 09:16:33.587888130
                                          NaN
                                                       NaN 2017-04-24 20:17:23
1997-02-27 16:48:23.051644929
                                          NaN
                                                       NaN 2017-04-26 02:41:43
1997-03-20 12:19:50.427611136
                                                       NaN 2017-05-01 01:47:28
                                          NaN
1997-04-04 18:13:13.139703809
                                                       NaN 2017-05-04 17:01:34
                                          {\tt NaN}
1997-04-13 09:33:55.999428608
                                          NaN
                                                       NaN 2017-05-06 18:27:40
1997-04-14 01:34:34.716409858
                                          NaN
                                                       NaN 2017-05-06 22:16:42
1997-05-12 21:16:22.782697472
                                                       NaN 2017-05-13 19:11:30
                                          NaN
1997-06-12 05:48:47.597207552
                                                       NaN 2017-05-21 00:53:21
                                          NaN
1997-06-23 13:30:53.475098625
                                                       NaN 2017-05-23 17:40:04
                                         {\tt NaN}
1997-07-11 16:44:37.480148993
                                                       NaN 2017-05-28 01:26:04
                                          NaN
1997-08-09 22:36:19.821445120
                                                       NaN 2017-06-04 00:46:17
                                          NaN
1997-09-04 01:49:08.698140672
                                                       NaN 2017-06-10 00:35:19
                                          NaN
1997-09-16 18:33:38.259525634
                                          NaN
                                                       NaN 2017-06-13 01:14:41
1997-10-23 12:52:52.832227328
                                                       NaN 2017-06-21 19:36:23
                                          NaN
1997-10-31 16:41:50.768087041
                                          NaN
                                                       NaN 2017-06-23 18:17:33
1997-11-01 17:19:37.348136964
                                                       NaN 2017-06-24 00:09:53
                                          NaN
1997-11-10 02:56:19.576475649
                                                       NaN 2017-06-26 00:13:58
                                          NaN
```

```
1998-01-29 06:09:20.059072513
                                        NaN
                                                      NaN 2017-07-15 02:45:48
                                                                         entities \
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1991-02-26 06:48:24.950915073
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                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
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1993-09-05 15:18:28.580548608
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                               {'hashtags': [], 'symbols': [], 'urls': [{'dis...
1993-11-07 19:52:24.171524096
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
1993-11-14 17:37:14.498793472
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1993-12-02 23:27:21.593970688
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1994-01-21 13:45:34.323924993
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1994-02-16 03:57:17.149827077
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                               {'hashtags': [], 'media': [{'display_url': 'pi...
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1994-03-08 22:51:03.695355904
1994-04-11 15:28:12.750233600
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1994-04-20 17:54:21.642756096
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1994-05-10 07:15:58.521745409
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
1994-05-14 10:02:47.477751808
                               {'hashtags': [], 'symbols': [], 'urls': [{'dis...
1994-05-19 08:19:51.808995329
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1994-05-28 02:56:07.776997377
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1996-12-04 02:54:54.696017920
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
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1996-12-30 13:51:42.622658560
                               {'hashtags': [], 'media': [{'display_url': 'pi...
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                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
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1997-02-05 10:24:01.867124737
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1997-02-06 16:08:43.840757760
1997-02-19 05:40:35.276025856
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
1997-02-22 09:16:33.587888130
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
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```

NaN

NaN 2017-07-13 01:35:06

1998-01-20 15:53:12.912609280

```
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1997-04-13 09:33:55.999428608
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                                {'hashtags': [], 'symbols': [], 'urls': [], 'u...
1997-04-14 01:34:34.716409858
1997-05-12 21:16:22.782697472
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
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1997-06-23 13:30:53.475098625
                               {'hashtags': [], 'media': [{'display_url': 'pi...
1997-07-11 16:44:37.480148993
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
1997-08-09 22:36:19.821445120
1997-09-04 01:49:08.698140672
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
                                {'hashtags': [], 'symbols': [], 'urls': [], 'u...
1997-09-16 18:33:38.259525634
                               {'hashtags': [], 'media': [{'display_url': 'pi...
1997-10-23 12:52:52.832227328
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
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1997-11-01 17:19:37.348136964
                               {'hashtags': [], 'symbols': [], 'urls': [], 'u...
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1997-11-10 02:56:19.576475649
                               {'hashtags': [], 'media': [{'display_url': 'pi...
1998-01-20 15:53:12.912609280
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                                                                extended_entities
1991-02-26 06:48:02.905632768
                               {'media': [{'display_url': 'pic.twitter.com/r7...
1991-02-26 06:48:24.950915073
                               {'media': [{'display_url': 'pic.twitter.com/ua...
1992-07-24 17:26:49.858043904
                                {'media': [{'display_url': 'pic.twitter.com/j6...
1993-07-28 05:05:15.802583040
                                                                               NaN
1993-08-28 07:04:05.350707200
                                                                              NaN
1993-09-05 15:18:28.580548608
                                                                               NaN
1993-11-03 06:49:54.570878976
                               {'media': [{'additional_media_info': {'monetiz...
1993-11-07 19:52:24.171524096
                                                                               NaN
1993-11-14 17:37:14.498793472
                                                                               NaN
1993-12-02 23:27:21.593970688
                               {'media': [{'display_url': 'pic.twitter.com/NL...
1994-01-03 11:51:44.299253760
                               {'media': [{'display_url': 'pic.twitter.com/7b...
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1994-01-21 13:45:34.323924993
                               {'media': [{'display_url': 'pic.twitter.com/Qn...
1994-01-26 06:47:08.574212096
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1994-02-02 01:52:29.710192640
                                                                               {\tt NaN}
1994-02-16 03:57:17.149827077
                                {'media': [{'display_url': 'pic.twitter.com/Ez...
1994-02-20 13:21:42.866649088
                                {'media': [{'display_url': 'pic.twitter.com/VG...
1994-03-08 22:51:03.695355904
                                                                               NaN
1994-04-11 15:28:12.750233600
                               {'media': [{'display_url': 'pic.twitter.com/vt...
1994-04-20 17:54:21.642756096
                                                                               NaN
1994-05-10 07:15:58.521745409
                                                                              NaN
1994-05-14 10:02:47.477751808
                                                                              {\tt NaN}
1994-05-19 08:19:51.808995329
                                                                               NaN
                               {'media': [{'display_url': 'pic.twitter.com/o5...
1994-05-28 02:56:07.776997377
1994-06-07 15:53:14.259247104
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1991-02-26 06:48:02.905632768
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1992-07-24 17:26:49.858043904
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1993-07-28 05:05:15.802583040
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1993-08-28 07:04:05.350707200
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1993-09-05 15:18:28.580548608
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1993-11-03 06:49:54.570878976
                               RT @dog_rates: Everyone needs to watch this. 1...
1993-11-07 19:52:24.171524096
                               RT @dog_rates: HEY PUP WHAT'S THE PART OF THE ...
1993-11-14 17:37:14.498793472
                               RT @dog_rates: This is Carly. She's actually 2...
1993-12-02 23:27:21.593970688
                               RT @dog_rates: This is Rubio. He has too much ...
1994-01-03 11:51:44.299253760
                               RT @jon_hill987: @dog_rates There is a cunning...
1994-01-05 00:19:23.776290825
                               RT @dog_rates: This is Chompsky. He lives up t...
1994-01-21 13:45:34.323924993
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                               RT @dog_rates: This... is a Tyrannosaurus rex...
1994-01-26 06:47:08.574212096
1994-02-02 01:52:29.710192640
                               RT @hownottodraw: The story/person behind @dog...
                               RT @dog_rates: Oh. My. God. 13/10 magical af h...
1994-02-16 03:57:17.149827077
1994-02-20 13:21:42.866649088
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                               RT @dog_rates: Meet Eve. She's a raging alcoho...
1994-03-08 22:51:03.695355904
1994-04-11 15:28:12.750233600
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1994-04-20 17:54:21.642756096
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1994-05-10 07:15:58.521745409
                               RT @dog_rates: This is Nollie. She's waving at...
1994-05-14 10:02:47.477751808
                               RT @dog_rates: When it's Janet from accounting...
1994-05-19 08:19:51.808995329
                               RT @dog_rates: Ever seen a dog pet another dog...
1994-05-28 02:56:07.776997377
                               RT @dog_rates: This is just downright precious...
1994-06-07 15:53:14.259247104
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                               RT @dog_rates: This is Frankie. He's wearing b...
1994-06-09 14:10:53.431250945
1994-06-26 07:22:04.260794368
                               RT @dog_rates: This is Gromit. He's pupset bec...
1994-07-04 15:46:27.167145985
                               RT @dog_rates: Meet Fizz. She thinks love is a...
                               RT @dog_rates: Like father (doggo), like son (...
1994-08-03 07:24:21.951791106
1994-08-07 08:58:26.839351296
                               RT @dog_rates: We only rate dogs. Pls stop sen...
1996-09-04 10:46:33.020538882
                               RT @dog_rates: This is Ken. His cheeks are mag...
1996-10-12 05:32:39.547420673
                               RT @dog_rates: This is Bungalo. She uses that ...
                               RT @basic_vacek_: I love my new mug easy 13/10...
1996-11-14 11:39:34.464610304
1996-11-14 13:41:05.427394560
                               RT @dog_rates: This is Charlie. He fell asleep...
                               RT @dog_rates: This is Gidget. She's a spy pup...
1996-12-04 02:54:54.696017920
1996-12-29 12:09:45.021730816
                               RT @eddie_coe98: Thanks @dog_rates completed m...
1996-12-30 13:51:42.622658560
                               RT @dog_rates: This is Astrid. She's a guide d...
1997-01-10 22:46:45.516943360
                               RT @dog_rates: I usually only share these on F...
                               RT @frasercampbell_: oh my... what's that... b...
1997-02-05 10:24:01.867124737
                               RT @dog_rates: Meet George. He looks slightly ...
1997-02-06 16:08:43.840757760
1997-02-19 05:40:35.276025856
                               RT @Jenna_Marbles: @dog_rates Thanks for ratin...
1997-02-22 09:16:33.587888130
                               RT @dog_rates: This is Luna. It's her first ti...
                               RT @AaronChewning: First time wearing my @dog_...
1997-02-27 16:48:23.051644929
1997-03-20 12:19:50.427611136
                               RT @dog_rates: Meet Winston. He knows he's a l...
1997-04-04 18:13:13.139703809
                               RT @dog_rates: Ohboyohboyohboyohboyohboyo...
1997-04-13 09:33:55.999428608
                               RT @tallylott: h*ckin adorable promposal. 13/1...
1997-04-14 01:34:34.716409858
                               RT @dog_rates: Meet Lorenzo. He's an avid nift...
1997-05-12 21:16:22.782697472
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1997-06-12 05:48:47.597207552
                               RT @dog_rates: Here's a pupper before and afte...
1997-06-23 13:30:53.475098625
                               RT @rachaeleasler: these @dog_rates hats are 1...
1997-07-11 16:44:37.480148993
                               RT @dog_rates: Say hello to Cooper. His expres...
1997-08-09 22:36:19.821445120
                               RT @dog_rates: This is Dawn. She's just checki...
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                               RT @dog_rates: This is Coco. At first I though...
1997-09-16 18:33:38.259525634
1997-10-23 12:52:52.832227328
                               RT @rachel2195: @dog_rates the boyfriend and h...
1997-10-31 16:41:50.768087041
                               RT @dog_rates: Meet Terrance. He's being yelle...
1997-11-01 17:19:37.348136964
                               RT @dog_rates: Meet Shadow. In an attempt to r...
1997-11-10 02:56:19.576475649
                               RT @dog_rates: This is Emmy. She was adopted t...
1998-01-20 15:53:12.912609280
                               RT @dog_rates: This is Lilly. She just paralle...
                               RT @Athletics: 12/10 #BATP https://t.co/WxwJmv...
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1993-11-03 06:49:54.570878976
                                        0
1993-11-07 19:52:24.171524096
                                        0
1993-11-14 17:37:14.498793472
                                        0
1993-12-02 23:27:21.593970688
                                        0
1994-01-03 11:51:44.299253760
                                        0
1994-01-05 00:19:23.776290825
                                        0
1994-01-21 13:45:34.323924993
                                        0
1994-01-26 06:47:08.574212096
                                        0
1994-02-02 01:52:29.710192640
                                        0
1994-02-16 03:57:17.149827077
                                        0
1994-02-20 13:21:42.866649088
                                        0
1994-03-08 22:51:03.695355904
                                        0
1994-04-11 15:28:12.750233600
                                        0
1994-04-20 17:54:21.642756096
                                        0
1994-05-10 07:15:58.521745409
                                        0
1994-05-14 10:02:47.477751808
                                        0
1994-05-19 08:19:51.808995329
                                        0
1994-05-28 02:56:07.776997377
                                        0
1994-06-07 15:53:14.259247104
                                        0
1994-06-09 14:10:53.431250945
                                        0
1994-06-26 07:22:04.260794368
                                        0
1994-07-04 15:46:27.167145985
                                        0
1994-08-03 07:24:21.951791106
                                        0
1994-08-07 08:58:26.839351296
                                        0
1996-09-04 10:46:33.020538882
                                        0
1996-10-12 05:32:39.547420673
                                        0
1996-11-14 11:39:34.464610304
                                        0
1996-11-14 13:41:05.427394560
                                        0
1996-12-04 02:54:54.696017920
                                        0
1996-12-29 12:09:45.021730816
                                        0
1996-12-30 13:51:42.622658560
                                        0
```

```
1997-02-05 10:24:01.867124737
                                       0
1997-02-06 16:08:43.840757760
                                       0
1997-02-19 05:40:35.276025856
                                       0
1997-02-22 09:16:33.587888130
                                       0
1997-02-27 16:48:23.051644929
                                       0
1997-03-20 12:19:50.427611136
                                       0
1997-04-04 18:13:13.139703809
                                       0
1997-04-13 09:33:55.999428608
                                       0
1997-04-14 01:34:34.716409858
                                       0
1997-05-12 21:16:22.782697472
                                       0
1997-06-12 05:48:47.597207552
                                        0
1997-06-23 13:30:53.475098625
                                       0
1997-07-11 16:44:37.480148993
                                       0
1997-08-09 22:36:19.821445120
                                       0
1997-09-04 01:49:08.698140672
                                       0
1997-09-16 18:33:38.259525634
                                       0
1997-10-23 12:52:52.832227328
                                       0
1997-10-31 16:41:50.768087041
                                       0
1997-11-01 17:19:37.348136964
                                       0
1997-11-10 02:56:19.576475649
                                       0
1998-01-20 15:53:12.912609280
                                       0
1998-01-29 06:09:20.059072513
                                       0
                                                                             user
1991-02-26 06:48:02.905632768
                               {'contributors_enabled': False, 'created_at': ...
1991-02-26 06:48:24.950915073
                               {'contributors_enabled': False, 'created_at': ...
1992-07-24 17:26:49.858043904
                               {'contributors_enabled': False, 'created_at': ...
                               {'contributors_enabled': False, 'created_at': ...
1993-07-28 05:05:15.802583040
1993-08-28 07:04:05.350707200
                               {'contributors_enabled': False, 'created_at': ...
                               {'contributors_enabled': False, 'created_at': ...
1993-09-05 15:18:28.580548608
1993-11-03 06:49:54.570878976
                               {'contributors_enabled': False, 'created_at': ...
1993-11-07 19:52:24.171524096
                               {'contributors_enabled': False, 'created_at': ...
1993-11-14 17:37:14.498793472
                               {'contributors_enabled': False, 'created_at': ...
1993-12-02 23:27:21.593970688
                               {'contributors_enabled': False, 'created_at': ...
1994-01-03 11:51:44.299253760
                               {'contributors_enabled': False, 'created_at': ...
1994-01-05 00:19:23.776290825
                               {'contributors_enabled': False, 'created_at': ...
                               {'contributors_enabled': False, 'created_at': ...
1994-01-21 13:45:34.323924993
                               {'contributors_enabled': False, 'created_at': ...
1994-01-26 06:47:08.574212096
1994-02-02 01:52:29.710192640
                               {'contributors_enabled': False, 'created_at': ...
                               {'contributors_enabled': False, 'created_at': ...
1994-02-16 03:57:17.149827077
1994-02-20 13:21:42.866649088
                               {'contributors_enabled': False, 'created_at': ...
1994-03-08 22:51:03.695355904
                               {'contributors_enabled': False, 'created_at': ...
1994-04-11 15:28:12.750233600
                               {'contributors_enabled': False, 'created_at': ...
1994-04-20 17:54:21.642756096
                               {'contributors_enabled': False, 'created_at': ...
```

0

1997-01-10 22:46:45.516943360

{'contributors_enabled': False, 'created_at': ...

{'contributors_enabled': False, 'created_at': ...

{'contributors_enabled': False, 'created_at': ...

1994-05-10 07:15:58.521745409

1994-05-14 10:02:47.477751808

1994-05-19 08:19:51.808995329

```
1996-09-04 10:46:33.020538882
                                        {'contributors_enabled': False, 'created_at': ...
         1996-10-12 05:32:39.547420673
                                        {'contributors_enabled': False, 'created_at': ...
         1996-11-14 11:39:34.464610304
                                        {'contributors_enabled': False, 'created_at': ...
         1996-11-14 13:41:05.427394560
                                        {'contributors_enabled': False, 'created_at': ...
                                        {'contributors_enabled': False, 'created_at': ...
         1996-12-04 02:54:54.696017920
         1996-12-29 12:09:45.021730816
                                        {'contributors_enabled': False, 'created_at': ...
         1996-12-30 13:51:42.622658560
                                        {'contributors_enabled': False, 'created_at': ...
         1997-01-10 22:46:45.516943360
                                        {'contributors_enabled': False, 'created_at': ...
         1997-02-05 10:24:01.867124737
                                        {'contributors_enabled': False, 'created_at': ...
         1997-02-06 16:08:43.840757760
                                        {'contributors_enabled': False, 'created_at': ...
         1997-02-19 05:40:35.276025856
                                        {'contributors_enabled': False, 'created_at': ...
         1997-02-22 09:16:33.587888130
                                        {'contributors_enabled': False, 'created_at': ...
         1997-02-27 16:48:23.051644929
                                        {'contributors_enabled': False, 'created_at': ...
         1997-03-20 12:19:50.427611136
                                        {'contributors_enabled': False, 'created_at': ...
         1997-04-04 18:13:13.139703809
                                        {'contributors_enabled': False, 'created_at': ...
         1997-04-13 09:33:55.999428608
                                        {'contributors_enabled': False, 'created_at': ...
         1997-04-14 01:34:34.716409858
                                        {'contributors_enabled': False, 'created_at': ...
         1997-05-12 21:16:22.782697472
                                        {'contributors_enabled': False, 'created_at': ...
         1997-06-12 05:48:47.597207552
                                        {'contributors_enabled': False, 'created_at': ...
         1997-06-23 13:30:53.475098625
                                        {'contributors_enabled': False, 'created_at': ...
                                        {'contributors_enabled': False, 'created_at': ...
         1997-07-11 16:44:37.480148993
         1997-08-09 22:36:19.821445120
                                        {'contributors_enabled': False, 'created_at': ...
                                        {'contributors_enabled': False, 'created_at': ...
         1997-09-04 01:49:08.698140672
         1997-09-16 18:33:38.259525634
                                        {'contributors_enabled': False, 'created_at': ...
                                        {'contributors_enabled': False, 'created_at': ...
         1997-10-23 12:52:52.832227328
         1997-10-31 16:41:50.768087041
                                        {'contributors_enabled': False, 'created_at': ...
         1997-11-01 17:19:37.348136964
                                        {'contributors_enabled': False, 'created_at': ...
         1997-11-10 02:56:19.576475649
                                        {'contributors_enabled': False, 'created_at': ...
         1998-01-20 15:53:12.912609280
                                        {'contributors_enabled': False, 'created_at': ...
         1998-01-29 06:09:20.059072513
                                        {'contributors_enabled': False, 'created_at': ...
         [168 rows x 30 columns]
In [50]: twitter_api_clean.drop(twitter_api_clean[twitter_api_clean['retweeted_status'].notnull(
In [51]: twitter_api_clean.info()
```

{'contributors_enabled': False, 'created_at': ...

{'contributors_enabled': False, 'created_at': ... {'contributors_enabled': False, 'created_at': ...

{'contributors_enabled': False, 'created_at': ...

{'contributors_enabled': False, 'created_at': ...

{'contributors_enabled': False, 'created_at': ...

{'contributors_enabled': False, 'created_at': ...

1994-05-28 02:56:07.776997377

1994-06-07 15:53:14.259247104

1994-06-09 14:10:53.431250945 1994-06-26 07:22:04.260794368

1994-07-04 15:46:27.167145985

1994-08-03 07:24:21.951791106

1994-08-07 08:58:26.839351296

Test

<class 'pandas.core.frame.DataFrame'>

DatetimeIndex: 2174 entries, 1991-02-08 13:48:08.022790149 to 1998-04-12 22:37:23.555336193

```
Data columns (total 30 columns):
                                  0 non-null float64
contributors
coordinates
                                  0 non-null float64
created_at
                                  2174 non-null datetime64[ns]
entities
                                  2174 non-null object
                                  1748 non-null object
extended_entities
favorite_count
                                  2174 non-null int64
favorited
                                  2174 non-null int64
                                 0 non-null float64
geo
                                  2174 non-null int64
tweet_id
                                  2174 non-null int64
id_str
                                 77 non-null object
in_reply_to_screen_name
                                  77 non-null float64
in_reply_to_status_id
                                 77 non-null float64
in_reply_to_status_id_str
                                  77 non-null float64
in_reply_to_user_id
in_reply_to_user_id_str
                                 77 non-null float64
is_quote_status
                                  2174 non-null int64
                                  2174 non-null object
lang
                                  1 non-null object
place
possibly_sensitive
                                  2116 non-null float64
possibly_sensitive_appealable
                                  2116 non-null float64
                                  24 non-null object
quoted_status
quoted_status_id
                                  25 non-null float64
                                  25 non-null float64
quoted_status_id_str
retweet_count
                                  2174 non-null int64
                                  2174 non-null int64
retweeted
retweeted_status
                                  O non-null object
source
                                  2174 non-null object
                                  2174 non-null object
text
                                  2174 non-null int64
truncated
                                  2174 non-null object
user
dtypes: datetime64[ns](1), float64(11), int64(8), object(10)
memory usage: 526.5+ KB
```

2.2.5 Tidiness

Define Remove unwanted columns from all datasets

Code To do that, I need to pull all datasets.info() and verify what column to keep and what column to remove before merging all three datasets together

```
in_reply_to_status_id
                         78 non-null float64
in_reply_to_user_id
                         78 non-null float64
                         2175 non-null object
source
                         2175 non-null object
text
expanded_urls
                         2117 non-null object
                         2175 non-null float64
rating_numerator
rating_denominator
                         2175 non-null float64
name
                         1390 non-null object
                         2175 non-null object
doggo
floofer
                         2175 non-null object
                         2175 non-null object
pupper
                         2175 non-null object
puppo
                         2175 non-null int64
year
                         2175 non-null int64
month
                         2175 non-null int64
dav
dtypes: float64(4), int64(4), object(8)
memory usage: 288.9+ KB
In [53]: # Delete unwanted columns from twitter_archive_clean
         twitter_archive_clean = twitter_archive_clean.drop(['source',
                                                               'in_reply_to_status_id',
                                                               'in_reply_to_user_id',
                                                               'expanded_urls'], 1)
Test
In [54]: twitter_archive_clean.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2175 entries, 0 to 2355
Data columns (total 12 columns):
tweet_id
                      2175 non-null int64
                      2175 non-null object
text
rating_numerator
                      2175 non-null float64
rating_denominator
                      2175 non-null float64
name
                      1390 non-null object
                      2175 non-null object
doggo
floofer
                      2175 non-null object
pupper
                      2175 non-null object
                      2175 non-null object
puppo
                      2175 non-null int64
year
month
                      2175 non-null int64
day
                      2175 non-null int64
dtypes: float64(2), int64(4), object(6)
memory usage: 220.9+ KB
In [55]: # Remove unwanted columns in the image dataset
```

image_clean.info()

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 1691 entries, 0 to 2073
Data columns (total 14 columns):
tweet_id
                   1691 non-null int64
                   1691 non-null object
jpg_url
                   1691 non-null int64
img_num
                   1691 non-null object
р1
p1_conf
                   1691 non-null float64
                   1691 non-null bool
p1_dog
p2
                   1691 non-null object
                   1691 non-null float64
p2_conf
                   1691 non-null bool
p2_dog
                   1691 non-null object
рЗ
                   1691 non-null float64
p3_conf
                   1691 non-null bool
p3_dog
                   1691 non-null object
dog_type
confidence_list
                   1691 non-null object
dtypes: bool(3), float64(3), int64(2), object(6)
memory usage: 163.5+ KB
Code
In [56]: #Delete columns
         image_clean = image_clean.drop(['img_num', 'p1',
                                                                 'p1_conf', 'p1_dog',
                                                                 'p2', 'p2_conf',
                                                                 'p2_dog', 'p3',
                                                                 'p3_conf',
                                                                 'p3_dog'], 1)
Test
In [57]: image_clean.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 1691 entries, 0 to 2073
Data columns (total 4 columns):
                   1691 non-null int64
tweet_id
jpg_url
                   1691 non-null object
                   1691 non-null object
dog_type
                   1691 non-null object
confidence_list
dtypes: int64(1), object(3)
memory usage: 66.1+ KB
In [58]: twitter_api_clean.info()
```

```
<class 'pandas.core.frame.DataFrame'>
DatetimeIndex: 2174 entries, 1991-02-08 13:48:08.022790149 to 1998-04-12 22:37:23.555336193
Data columns (total 30 columns):
contributors
                                 0 non-null float64
coordinates
                                 0 non-null float64
                                 2174 non-null datetime64[ns]
created_at
entities
                                 2174 non-null object
extended_entities
                                 1748 non-null object
                                 2174 non-null int64
favorite_count
favorited
                                 2174 non-null int64
                                 O non-null float64
geo
                                 2174 non-null int64
tweet_id
                                 2174 non-null int64
id_str
                                 77 non-null object
in_reply_to_screen_name
in_reply_to_status_id
                                 77 non-null float64
in_reply_to_status_id_str
                                 77 non-null float64
in_reply_to_user_id
                                 77 non-null float64
in_reply_to_user_id_str
                                 77 non-null float64
is_quote_status
                                 2174 non-null int64
                                 2174 non-null object
lang
place
                                  1 non-null object
                                 2116 non-null float64
possibly_sensitive
possibly_sensitive_appealable
                                 2116 non-null float64
                                 24 non-null object
quoted_status
                                 25 non-null float64
quoted_status_id
                                 25 non-null float64
quoted_status_id_str
                                 2174 non-null int64
retweet_count
retweeted
                                 2174 non-null int64
                                 O non-null object
retweeted status
                                 2174 non-null object
source
                                 2174 non-null object
text
truncated
                                 2174 non-null int64
user
                                 2174 non-null object
dtypes: datetime64[ns](1), float64(11), int64(8), object(10)
memory usage: 526.5+ KB
```

Code

```
'in_reply_to_status_id',
                               'in_reply_to_status_id_str',
                               'in_reply_to_user_id',
                               'in_reply_to_user_id_str',
                               'is_quote_status',
                               'lang',
                               'place',
                               'possibly_sensitive',
                               'possibly_sensitive_appealable',
                               'quoted_status',
                               'quoted_status_id',
                               'quoted_status_id_str',
                               'retweeted',
                               'retweeted_status',
                               'source',
                               'truncated',
                               'user'], axis=1,inplace=True)
In [60]: twitter_api_clean.head()
                                         favorite_count
                                                                    tweet_id \
         1991-02-08 13:48:08.022790149
                                                   2544 666020888022790144
                                                    129 666029285002620928
                                                     125 666033412701032448
```

'in_reply_to_screen_name',

```
1991-02-08 16:08:05.002620928
1991-02-08 17:16:52.701032449
1991-02-08 20:17:06.329800704
                                          296 666044226329800704
1991-02-08 21:40:48.165822465
                                          107 666049248165822464
                               retweet_count \
1991-02-08 13:48:08.022790149
                                         508
1991-02-08 16:08:05.002620928
                                          47
1991-02-08 17:16:52.701032449
                                          44
1991-02-08 20:17:06.329800704
                                         139
1991-02-08 21:40:48.165822465
                                          40
                                                                            text
1991-02-08 13:48:08.022790149 Here we have a Japanese Irish Setter. Lost eye...
1991-02-08 16:08:05.002620928 This is a western brown Mitsubishi terrier. Up...
1991-02-08 17:16:52.701032449 Here is a very happy pup. Big fan of well-main...
1991-02-08 20:17:06.329800704 This is a purebred Piers Morgan. Loves to Netf...
1991-02-08 21:40:48.165822465 Here we have a 1949 1st generation vulpix. Enj...
```

Define Twitter_archive - Combine each dog stage column into a single column named "stage"

code

Test

Out[60]:

```
In [61]: # Combine dogs 4 stage columns into one column 'stage' list
         # append each stage list into a bigger list
        stage = pd.melt(twitter_archive_clean, id_vars=['tweet_id'], value_vars=['doggo', 'floor

         stage_list = []
        for ids in stage.tweet_id.unique():
             stage_list.append(stage.query('tweet_id == @ids').value.tolist())
In [62]: # remove repeat value in each stage list
        stage_list2 = []
         for e in stage_list:
             stage_list2.append(list(set(e)))
In [63]: # remove the 'None' in stage list which contains any stage value, such as 'doggo', 'flo
        stage_list3 = []
         for e in stage_list2:
             if len(e) > 1:
                 e.remove('None')
                 stage_list3.append(e)
             else:
                 stage_list3.append(e)
In [64]: # remove '[]' which wrapped outside the stage value
        stage_list4 = []
         for e in stage_list3:
             if len(e) > 1:
                 stage_list4.append(",".join(e))
             else:
                 stage_list4.append(e[0])
In [65]: twitter_archive_clean['stage'] = stage_list4
Test
In [66]: twitter_archive_clean.head()
Out[66]:
                                                                             text \
                      tweet_id
         O 892420643555336193 This is Phineas. He's a mystical boy. Only eve...
         1 892177421306343426 This is Tilly. She's just checking pup on you...
         2 891815181378084864 This is Archie. He is a rare Norwegian Pouncin...
         3 891689557279858688 This is Darla. She commenced a snooze mid meal...
         4 891327558926688256 This is Franklin. He would like you to stop ca...
                                                      name doggo floofer pupper puppo \
            rating_numerator rating_denominator
        0
                        13.0
                                            10.0
                                                   Phineas None
                                                                    None
                                                                           None None
                        13.0
                                            10.0
                                                                           None None
         1
                                                     Tilly None
                                                                    None
         2
                        12.0
                                            10.0
                                                    Archie None
                                                                    None
                                                                           None None
                        13.0
        3
                                            10.0
                                                     Darla None
                                                                    None
                                                                           None None
         4
                        12.0
                                            10.0 Franklin None
                                                                    None
                                                                           None None
```

```
year month day stage
        0 2017
                      8
                          1 None
        1 2017
                      8
                          1 None
        2 2017
                      7
                          31 None
        3 2017
                      7
                          30 None
         4 2017
                          29 None
In [67]: twitter_archive_clean['stage'].value_counts()
Out[67]: None
                          1831
                           224
        pupper
                            75
        doggo
                            24
        puppo
                            10
        pupper, doggo
        floofer
                             9
        doggo,floofer
        puppo, doggo
        Name: stage, dtype: int64
```

Define There are some dogs or tweet_id that has two stages. We need to find them

Code

```
In [68]: # One floofer, doggo
        twitter_archive_clean.query('stage == "floofer,doggo"')
Out[68]: Empty DataFrame
        Columns: [tweet_id, text, rating_numerator, rating_denominator, name, doggo, floofer, p
        Index: []
In [69]: # One puppo, doggo
        twitter_archive_clean.query('stage == "puppo,doggo"')
Out[69]:
                        tweet_id
         191 855851453814013952 Here's a puppo participating in the #ScienceMa...
              rating_numerator rating_denominator name doggo floofer pupper puppo \
                          13.0
         191
                                              10.0 NaN doggo
                                                                  None
                                                                         None puppo
              year month day
                                     stage
         191 2017
                            22 puppo, doggo
In [70]: # Ten doggo, pupper
        twitter_archive_clean.query('stage == "doggo,pupper"').head()
Out[70]: Empty DataFrame
        Columns: [tweet_id, text, rating_numerator, rating_denominator, name, doggo, floofer, p
         Index: []
```

Define All datasets Convert tweet_id column from an integer to a string value

```
Code
```

0

12.0

```
In [71]: twitter_archive_clean['tweet_id'] = twitter_archive_clean['tweet_id'].astype('str')
         image_clean['tweet_id'] = image_clean['tweet_id'].astype('str')
         twitter_api_clean['tweet_id'] = twitter_api_clean['tweet_id'].astype('str')
Test
In [72]: type(twitter_archive_clean['tweet_id'].iloc[0]), type(image_clean['tweet_id'].iloc[0]),
         type(twitter_api_clean['tweet_id'].iloc[0])
Out[72]: (str, str, str)
Define Twitter_archive - Convert Rating columns to float values
Code
In [73]: # This step was done in the quality stage but I wanted to make sure it is float now
         twitter_archive_clean['rating_numerator'] = twitter_archive_clean['rating_numerator'].a
         twitter_archive_clean['rating_denominator'] = twitter_archive_clean['rating_denominator
Test
In [74]: twitter_archive_clean['rating_numerator'].dtype, twitter_archive_clean['rating_denomina
Out[74]: (dtype('float64'), dtype('float64'))
Define Consolidate the 3 datasets into 1
Code
In [75]: twitter_archive_master = pd.merge(pd.merge(twitter_archive_clean, image_clean, on='twee
                                           twitter_api_clean, on = 'tweet_id')
Test
In [76]: twitter_archive_master.head()
Out[76]:
                      tweet_id
                                                                           text_x \
         0 891815181378084864 This is Archie. He is a rare Norwegian Pouncin...
         1 891689557279858688 This is Darla. She commenced a snooze mid meal...
         2 891327558926688256 This is Franklin. He would like you to stop ca...
         3 891087950875897856 Here we have a majestic great white breaching ...
         4 890729181411237888 When you watch your owner call another dog a g...
            rating_numerator rating_denominator
                                                      name doggo floofer pupper puppo \
```

10.0

Archie None

None None

None

```
2
                        12.0
                                            10.0 Franklin None
                                                                    None
                                                                           None None
         3
                        13.0
                                            10.0
                                                       {\tt NaN}
                                                           None
                                                                    None
                                                                           None None
                        13.0
                                            10.0
                                                       NaN None
                                                                    None
                                                                           None None
                                                                            jpg_url \
            year month day stage
                              None https://pbs.twimg.com/media/DGBdLU1WsAANxJ9.jpg
           2017
                      7
         1
           2017
                      7
                          30 None https://pbs.twimg.com/media/DF_q7IAWsAEuuN8.jpg
         2 2017
                          29 None https://pbs.twimg.com/media/DF6hr6BUMAAzZgT.jpg
                      7
                          29 None https://pbs.twimg.com/media/DF3HwyEWsAABqE6.jpg
         3 2017
                      7
         4 2017
                          28 None https://pbs.twimg.com/media/DFyBahAVwAAhUTd.jpg
                            dog_type confidence_list favorite_count retweet_count
         0
                           chihuahua
                                            0.716012
                                                               24670
                                                                                4090
         1
                  labrador retriever
                                            0.168086
                                                               41532
                                                                                8505
                                                               39725
         2
                              basset
                                            0.555712
                                                                               9213
         3
           chesapeake bay retriever
                                            0.425595
                                                               19938
                                                                               3065
                                            0.566142
                                                               64480
                                                                               18570
                          pomeranian
                                                       text_y
         O This is Archie. He is a rare Norwegian Pouncin...
         1 This is Darla. She commenced a snooze mid meal...
         2 This is Franklin. He would like you to stop ca...
         3 Here we have a majestic great white breaching ...
         4 When you watch your owner call another dog a g...
In [77]: # I forgot to drop 'doggo', 'puppo', 'pupper', 'floofer' columns. I can implement it or
         twitter_archive_master.drop(['doggo', 'puppo', 'pupper', 'floofer'], axis=1,inplace=Tru
In [78]: # Order the table by tweet_id then reset index accordingly
         twitter_archive_master.sort_values('tweet_id', inplace=True)
         twitter_archive_master= twitter_archive_master.set_index('tweet_id')
In [79]: # add rating column
         twitter_archive_master['rating'] = twitter_archive_master.rating_numerator/twitter_archive_master.
In [80]: twitter_archive_master.head()
Out[80]:
                                                                        text x \
         tweet_id
         666029285002620928 This is a western brown Mitsubishi terrier. Up...
         666044226329800704 This is a purebred Piers Morgan. Loves to Netf...
         666057090499244032 My oh my. This is a rare blond Canadian terrie...
         666058600524156928 Here is the Rand Paul of retrievers folks! He'...
         666071193221509120 Here we have a northern speckled Rhododendron...
                             rating_numerator rating_denominator name year month \
         tweet_id
         666029285002620928
                                          7.0
                                                             10.0 NaN 2015
                                                                                  11
```

10.0

Darla None

None None

None

13.0

1

```
666044226329800704
                                 6.0
                                                    10.0 NaN
                                                               2015
                                                                         11
                                                    10.0 NaN 2015
666057090499244032
                                 9.0
                                                                         11
666058600524156928
                                 8.0
                                                    10.0 NaN
                                                               2015
                                                                         11
666071193221509120
                                 9.0
                                                    10.0 NaN 2015
                                                                         11
                    day stage \
tweet_id
666029285002620928
                     15
                         None
666044226329800704
                         None
                     16
666057090499244032
                     16
                         None
666058600524156928
                        None
                     16
666071193221509120
                     16 None
                                                            jpg_url \
tweet id
666029285002620928
                    https://pbs.twimg.com/media/CT42GRgUYAA5iDo.jpg
666044226329800704
                    https://pbs.twimg.com/media/CT5Dr8HUEAA-lEu.jpg
666057090499244032
                    https://pbs.twimg.com/media/CT5PY90WoAAQGLo.jpg
                    https://pbs.twimg.com/media/CT5Qw94XAAA_2dP.jpg
666058600524156928
666071193221509120
                    https://pbs.twimg.com/media/CT5cN_3WEAA10oZ.jpg
                               dog_type confidence_list favorite_count \
tweet_id
666029285002620928
                                redbone
                                               0.506826
                                                                     129
666044226329800704 rhodesian ridgeback
                                               0.408143
                                                                     296
                                                                     294
666057090499244032
                       golden retriever
                                             0.00795896
666058600524156928
                       miniature poodle
                                               0.201493
                                                                     111
666071193221509120
                          gordon setter
                                               0.503672
                                                                     145
                    retweet_count
tweet id
666029285002620928
                               47
666044226329800704
                              139
666057090499244032
                              141
666058600524156928
                               57
666071193221509120
                               59
                                                               text_y rating
tweet_id
666029285002620928
                    This is a western brown Mitsubishi terrier. Up...
                                                                           0.7
666044226329800704
                    This is a purebred Piers Morgan. Loves to Netf...
                                                                           0.6
                    My oh my. This is a rare blond Canadian terrie...
666057090499244032
                                                                           0.9
666058600524156928
                    Here is the Rand Paul of retrievers folks! He'...
                                                                           0.8
666071193221509120 Here we have a northern speckled Rhododendron...
                                                                          0.9
```

In [81]: twitter_archive_master.info()

<class 'pandas.core.frame.DataFrame'>

Index: 1056 entries, 666029285002620928 to 891815181378084864

```
Data columns (total 15 columns):
text_x
                       1056 non-null object
                       1056 non-null float64
rating_numerator
rating_denominator
                       1056 non-null float64
name
                       730 non-null object
                       1056 non-null int64
year
                       1056 non-null int64
month
day
                       1056 non-null int64
                       1056 non-null object
stage
jpg_url
                       1056 non-null object
                       1056 non-null object
dog_type
                       1056 non-null object
confidence_list
                       1056 non-null int64
favorite_count
retweet_count
                       1056 non-null int64
text_y
                       1056 non-null object
                       1056 non-null float64
rating
dtypes: float64(3), int64(5), object(7)
memory usage: 132.0+ KB
In [82]: twitter_archive_master.describe()
Out[82]:
                 rating_numerator
                                    rating_denominator
                                                                year
                                                                             month
                      1056.000000
         count
                                           1056.000000
                                                         1056.000000
                                                                      1056.000000
                        11.379735
                                             10.519886
                                                         2015.846591
                                                                          7.145833
         mean
         std
                         8.563492
                                              7.219483
                                                            0.690592
                                                                          4.077628
                         1.000000
                                              2.000000
                                                         2015.000000
                                                                          1.000000
         min
         25%
                        10.000000
                                             10.000000
                                                         2015.000000
                                                                          3.000000
         50%
                        11.000000
                                             10.000000
                                                         2016.000000
                                                                          7.000000
         75%
                        12.000000
                                             10.000000
                                                         2016.000000
                                                                         11.000000
                       165.000000
                                            150.000000
                                                         2017.000000
                                                                         12.000000
         max
                              favorite_count
                                               retweet_count
                                                                    rating
                         day
```

```
1056.000000
                                                       1056.000000
count
                        1056.000000
                                         1056.000000
         16.110795
                        7911.772727
                                         2255.431818
                                                          1.081182
mean
std
          8.759344
                       10653.075588
                                         3281.921062
                                                          0.282588
          1.000000
                           80.000000
                                           12.000000
                                                          0.200000
min
25%
                                          560.750000
                                                          1.000000
          8.000000
                        1755.000000
50%
         17.000000
                        3793.000000
                                         1240.000000
                                                          1.100000
75%
         24.000000
                        9637.500000
                                         2715.000000
                                                          1.200000
         31.000000
                       91088.000000
                                        33954.000000
                                                          7.500000
max
```

In [83]: twitter_archive_master.shape

Out[83]: (1056, 15)

2.2.6 Late Quality issue correction

Define One thing more I found out I needed to do, make sure that "None" in dogs stages is programmable. Note this is a qaulity issue

Code

```
In [84]: twitter_archive_master.stage = twitter_archive_master.stage.replace('None', np.nan)
Test
In [85]: twitter_archive_master.head()
Out[85]:
                                                                        text x \
         tweet_id
         666029285002620928 This is a western brown Mitsubishi terrier. Up...
         666044226329800704 This is a purebred Piers Morgan. Loves to Netf...
         666057090499244032 My oh my. This is a rare blond Canadian terrie...
         666058600524156928 Here is the Rand Paul of retrievers folks! He'...
         666071193221509120 Here we have a northern speckled Rhododendron...
                             rating_numerator rating_denominator name year month \
         tweet_id
                                          7.0
         666029285002620928
                                                             10.0 NaN 2015
                                                                                 11
                                                             10.0 NaN 2015
         666044226329800704
                                          6.0
                                                                                 11
         666057090499244032
                                          9.0
                                                             10.0 NaN 2015
                                                                                 11
         666058600524156928
                                          8.0
                                                             10.0 NaN 2015
                                                                                 11
         666071193221509120
                                          9.0
                                                             10.0 NaN 2015
                                                                                 11
                             day stage \
         tweet_id
         666029285002620928
                              15
                                   NaN
                                   NaN
         666044226329800704
                              16
         666057090499244032
                              16
                                   NaN
         666058600524156928
                                   NaN
                              16
         666071193221509120
                              16
                                   NaN
                                                                     jpg_url \
         tweet_id
                             https://pbs.twimg.com/media/CT42GRgUYAA5iDo.jpg
         666029285002620928
                             https://pbs.twimg.com/media/CT5Dr8HUEAA-1Eu.jpg
         666044226329800704
         666057090499244032
                             https://pbs.twimg.com/media/CT5PY90WoAAQGLo.jpg
         666058600524156928
                             https://pbs.twimg.com/media/CT5Qw94XAAA_2dP.jpg
                             https://pbs.twimg.com/media/CT5cN_3WEAA10oZ.jpg
         666071193221509120
                                        dog_type confidence_list favorite_count \
         tweet_id
                                                        0.506826
         666029285002620928
                                         redbone
                                                                             129
         666044226329800704
                             rhodesian ridgeback
                                                        0.408143
                                                                             296
                                golden retriever
         666057090499244032
                                                      0.00795896
                                                                             294
         666058600524156928
                                miniature poodle
                                                        0.201493
                                                                             111
         666071193221509120
                                   gordon setter
                                                        0.503672
                                                                             145
```

retweet_count

```
666057090499244032
                                       141
         666058600524156928
                                        57
                                        59
         666071193221509120
         tweet_id
         666029285002620928 This is a western brown Mitsubishi terrier. Up...
         666044226329800704 This is a purebred Piers Morgan. Loves to Netf...
         666057090499244032 My oh my. This is a rare blond Canadian terrie...
         666058600524156928 Here is the Rand Paul of retrievers folks! He'...
         666071193221509120 Here we have a northern speckled Rhododendron...
In [89]: twitter_archive_master.info()
<class 'pandas.core.frame.DataFrame'>
Index: 1056 entries, 666029285002620928 to 891815181378084864
Data columns (total 15 columns):
                      1056 non-null object
text_x
                      1056 non-null float64
rating_numerator
rating_denominator
                      1056 non-null float64
                      730 non-null object
name
                      1056 non-null int64
year
                      1056 non-null int64
month
                      1056 non-null int64
day
                      164 non-null object
stage
                      1056 non-null object
jpg_url
                      1056 non-null object
dog_type
confidence_list
                      1056 non-null object
favorite_count
                      1056 non-null int64
retweet_count
                      1056 non-null int64
                      1056 non-null object
text_y
                      1056 non-null float64
rating
dtypes: float64(3), int64(5), object(7)
memory usage: 132.0+ KB
```

47

139

text_y rating

0.7

0.6

0.9

0.8

0.9

2.3 Second Part - Storing, Analyzing, and Visualizing Wrangled Data

2.3.1 Storing Wrnagled Data

tweet id

666029285002620928

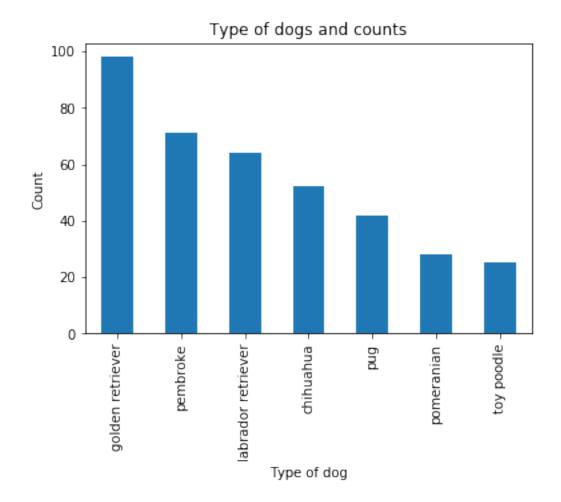
666044226329800704

```
In [151]: twitter_archive_master.to_csv('twitter_archive_master.csv', index=False, encoding = 'u
```

2.3.2 Analyzing Wrnagled Data

First Analysis and Visualizing - Dogs Counts

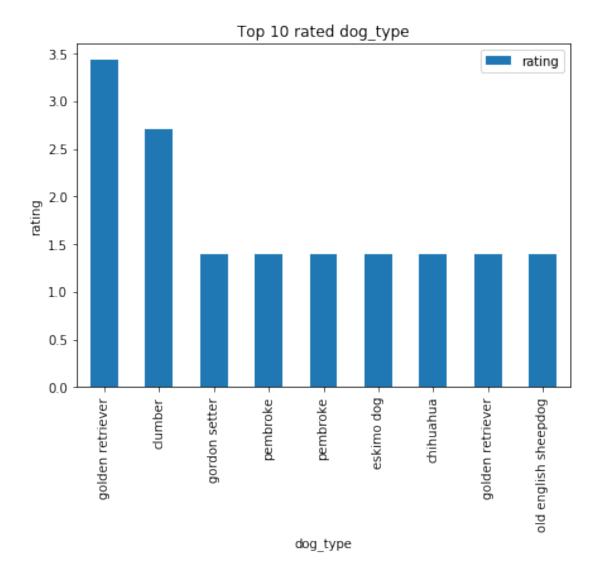
```
In [91]: # High counts of rated dogs are
         twitter_archive_master['dog_type'].value_counts().head(10)
Out[91]: golden retriever
                                     98
         pembroke
                                     71
         labrador retriever
                                     64
         chihuahua
                                     52
                                     42
         pug
                                     28
         pomeranian
                                     25
         toy poodle
         chow
                                     24
                                     22
         chesapeake bay retriever
         cocker spaniel
                                     21
         Name: dog_type, dtype: int64
In [92]: # Low counts of rated dogs are
         twitter_archive_master['dog_type'].value_counts().tail(15)
Out[92]: komondor
                                    2
                                    2
         leonberg
         brabancon griffon
                                    2
         wire-haired fox terrier
                                    2
         afghan hound
                                    1
         standard schnauzer
                                    1
         black-and-tan coonhound
                                    1
         groenendael
                                    1
         clumber
                                    1
         welsh springer spaniel
         bluetick
                                    1
         toy terrier
         irish wolfhound
         silky terrier
                                    1
         japanese spaniel
         Name: dog_type, dtype: int64
In [93]: dog_type = twitter_archive_master.groupby('dog_type').filter(lambda x: len(x) >= 25)
         dog_type['dog_type'].value_counts().plot(kind = 'bar')
         plt.title('Type of dogs and counts')
         plt.xlabel('Type of dog')
         plt.ylabel('Count');
```



It seems like the Golden Retriver has the highest rating counts then pembroke the second. So it would make sense later when analyze the highly rated dogs to take the first 10 to be more accurate

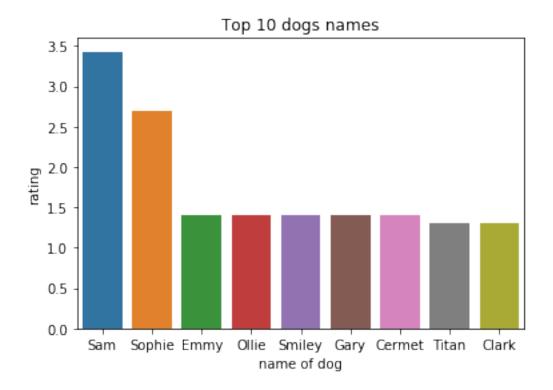
Dogs Rating

```
In [153]: top10_rating = twitter_archive_master.query('dog_type == dog_type').sort_values\
          ('rating', ascending = False)[1:10]
          top10_rating = top10_rating['dog_type']
          top10_rating
Out[153]: tweet_id
          810984652412424192
                                     golden retriever
          778027034220126208
                                              clumber
          820314633777061888
                                        gordon setter
          832273440279240704
                                             pembroke
          884441805382717440
                                             pembroke
          774314403806253056
                                           eskimo dog
          856282028240666624
                                            chihuahua
          807621403335917568
                                     golden retriever
```



Here I wanted to verify whether the dogs that were rated in terms of counts, are getting high ratings too. Our conclusion was Golden Retriver, Dumbles, and Golden Setter are three highest rate dogs while Golden Retriver, pembroke, and labrador retriever had the three highest counts

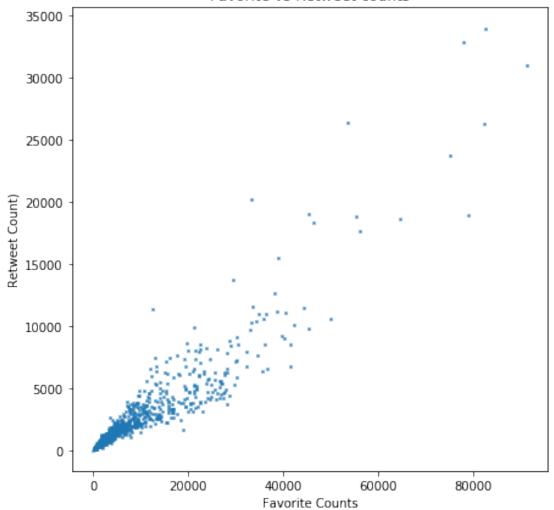
Second Analysis and Visualizing - Top 10 Rating Dogs' Names Out of curiousity I wanted to know the names of these dogs



Sam, Sophie and Emmy are the names of these highly rated dogs

Third Analysis and Visualizing - Favorite vs Retweet Counts





Here I wanted to see the correlation between the counts of favorite and retweets. Seems like we have positive to strong positive correlation

Fourth Analysis and Visualizing - Averages of Dogs Stages

```
In [122]: twitter_archive_master.stage.value_counts().index.tolist()
```

```
In [150]: # exclude NA value first and then visualize the stage composition
          labels = twitter_archive_master.stage.value_counts().index.tolist()
          sizes = twitter_archive_master.stage.value_counts().tolist()
          plt.figure(figsize=(8, 8))
          plt.pie(sizes, labels=labels, explode=explode, colors=colors, autopct='%1.1f%%', start
          plt.axis('equal');
     pupper,doggo
         puppo,doggo
                                          puppo
                                                                     doggo
                                               7.9%
                                     floofer
                                                              17.1%
                            doggo,floofer
                                           0.6%
                                                   69.5%
```

Puppers represent almost 70% then doggos represent 17%

2.4 Third Part - Reporting on:

- Wrangling Efforts
- Data Analyses and Visualizations

Both reports are attached in the submission file

pupper