wrangle_act

February 5, 2018

1 Introduction

Real-world data rarely comes clean. This project on 'Data Wrangling' involves 3 main steps namely:- 1. Gathering 2. Assessing 3. Cleaning

Throughout this project several python libraries will be used to gather data from a variety of sources and in a variety of formats, assess its quality and tidiness, then clean it.

The Dataset

The dataset that i will be wrangling (and analyzing and visualizing) is the tweet archive of Twitter user @dog_rates, also known as WeRateDogs. WeRateDogs is a Twitter account that rates people's dogs with a humorous comment about the dog. These ratings almost always have a denominator of 10. The numerators, though? Almost always greater than 10. 11/10, 12/10, 13/10, etc. Why? Because "they're good dogs Brent." WeRateDogs has over 4 million followers and has received international media coverage.

1.1 1. Gathering

This step involves gathering data from 3 different sources as shown below:-

1. Download the file "twitter_archive_enhanced.csv" manually from the given link and read it. This file is from the WeRateDogs Twitter archive.

```
In [1]: import pandas as pd
        twitter_archive = pd.read_csv("twitter-archive-enhanced.csv")
        twitter archive.head()
Out[1]:
                     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
          2017-08-01 00:17:27 +0000
        2 2017-07-31 00:18:03 +0000
```

```
2017-07-30 15:58:51 +0000
   2017-07-29 16:00:24 +0000
                                                source \
0
   <a href="http://twitter.com/download/iphone" r...</pre>
                                                  text retweeted_status_id \
   This is Phineas. He's a mystical boy. Only eve...
                                                                         NaN
   This is Tilly. She's just checking pup on you...
                                                                        NaN
   This is Archie. He is a rare Norwegian Pouncin...
                                                                         NaN
   This is Darla. She commenced a snooze mid meal...
                                                                         NaN
   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
4
                         NaN
                                                     NaN
                                         expanded_urls rating_numerator
   https://twitter.com/dog_rates/status/892420643...
                                                                       13
   https://twitter.com/dog_rates/status/892177421...
                                                                       13
  https://twitter.com/dog_rates/status/891815181...
                                                                       12
   https://twitter.com/dog_rates/status/891689557...
                                                                       13
   https://twitter.com/dog_rates/status/891327558...
                                                                       12
   rating_denominator
                            name doggo floofer pupper puppo
0
                                 None
                    10
                         Phineas
                                           None
                                                  None
                                                        None
1
                    10
                                           None
                                                  None
                                                        None
                           Tilly None
2
                    10
                          Archie None
                                           None
                                                  {	t None}
                                                        None
3
                    10
                           Darla None
                                           None
                                                  None
                                                        None
4
                        Franklin None
                                           None
                                                  None None
```

2. Programmatically download "tweet image predictions" using Requests library The tweet image predictions, i.e., what breed of dog (or other object, animal, etc.) is present in each tweet according to a neural network. This file (image_predictions.tsv) is hosted on Udacity's servers and should be downloaded programmatically using the Requests library and the following URL: https://d17h27t6h515a5.cloudfront.net/topher/2017/August/599fd2ad_image-predictions/image-predictions.tsv

```
In [2]: import requests
    import os
```

```
folder_name = 'Data Wrangling Project Files'
       if not os.path.exists(folder_name):
           os.makedirs(folder name)
       url = 'https://d17h27t6h515a5.cloudfront.net/topher/2017/August/599fd2ad_image-predictic
       response = requests.get(url)
       with open(os.path.join(folder_name, url.split('/')[-1]), mode = 'wb') as file:
           file.write(response.content)
In [3]: os.listdir(folder_name)
Out[3]: ['image-predictions.tsv']
In [4]: image_pred = pd.read_csv('image-predictions.tsv',sep='\t')
  3. Use Tweepy library to query Twitter's API for additional data __ Code used to query the
twitter ApI to gather tweet_json.txt __
  Create API object to access the needed information
  import tweepy
  auth = tweepy.OAuthHandler(consumer_key, consumer_secret)
  auth.set_access_token(access_token, access_secret)
  api = tweepy.API(auth)
  Query and write the collected data to a text file
  import pandas as pd
  twitter_archive = pd.read_csv("twitter-archive-enhanced.csv")
  tweet_id = twitter_archive.tweet_id
  file = open('tweet_json.txt','w')
  for id in tweet_id:
try:
   tweet = api.get_status(id)
   a= tweet.text
   b= tweet.favorite_count
   c= tweet.retweet_count
   file.write(a +'\n')
   file.write( str(b) + ' n')
   file.write(str(c) +'\n')
except:
   file.write('NA'+ '\n')
   file.write('NA'+ '\n')
   file.write('NA'+ '\n')
```

```
file.close()
```

```
In [5]: # counting total number of lines in txt file
        with open('tweet_json.txt') as f:
            print sum(1 for _ in f)
7068
In [6]: df_list = []
        with open('tweet_json.txt') as file:
            # 7068/3 = 2356, so use a range from 1 to 2357 to get all rows from "tweet_json.txt"
            for x in range(1, 2357):
                text = file.readline()[:-1]
                favorite_count = file.readline()[:-1]
                retweet_count = file.readline()[:-1]
                df_list.append({'text': text,
                                   'favorite_count': favorite_count,
                                    'retweet_count': retweet_count})
                x = x + 1
        import pandas as pd
        df = pd.DataFrame(df_list, columns=['text','favorite_count','retweet_count'])
In [7]: df
Out[7]:
                                                              text favorite_count \
              This is Phineas. He's a mystical boy. Only eve...
                                                                             39164
        0
                                                                                NA
        1
        2
                                                                NA
                                                                                NA
        3
              This is Darla. She commenced a snooze mid meal...
                                                                             42534
        4
                                                                                ΝA
        5
                                                                NΑ
                                                                                NΑ
        6
                                                                NΑ
                                                                                ΝA
        7
                                                                NΑ
                                                                                ΝA
                                                                NA
                                                                                NA
        8
                                                                NA
        9
                                                                                NA
        10
                                                                                NA
              This is Bruno. He is a service shark. Only get...
                                                                             28037
        11
              Here's a puppo that seems to be on the fence a...
        12
                                                                             48329
              This is Ted. He does his best. Sometimes that'...
        13
                                                                             27427
        14
                                                                NA
                                                                                NA
        15
                                                                NA
                                                                                NA
              This is {\tt Jim.} He found a fren. Taught {\tt him} how {\tt t...}
        16
                                                                             29345
        17
              This is Ralphus. He's powering up. Attempting ...
        18
                                                                             20115
        19
                                                                                NA
                                                                NA
        20
                                                                NA
                                                                                ΝA
        21
                                                                NΑ
                                                                                NA
        22
              I've yet to rate a Venezuelan Hover Wiener. Th...
                                                                             46621
```

```
This is Canela. She attempted some fancy porch...
23
                                                                  69808
      You may not have known you needed to see this ...
24
                                                                  33977
25
                                                                     NA
26
      This is Maya. She's very shy. Rarely leaves he...
                                                                  35517
27
                                                                     NΑ
28
      This is Derek. He's late for a dog meeting. 13...
                                                                  22631
29
. . .
                                                                    . . .
     This is quite the dog. Gets really excited whe...
2326
                                                                    453
     This is a southern Vesuvius bumblegruff. Can d...
2327
                                                                    112
      Oh goodness. A super rare northeast Qdoba kang...
2328
                                                                    170
     Those are sunglasses and a jean jacket. 11/10 ...
2329
                                                                    193
     Unique dog here. Very small. Lives in containe...
2330
                                                                    790
2331
                                                                     NA
     Look at this jokester thinking seat belt laws ...
2332
                                                                    305
     This is an extremely rare horned Parthenon. No...
                                                                    202
2333
2334
     This is a funny dog. Weird toes. Won't come do...
                                                                    513
2335
     This is an Albanian 3 1/2 legged Episcopalian...
                                                                    151
2336
         Can take selfies 11/10 https://t.co/ws2AMaNwPW
                                                                    179
2337
     Very concerned about fellow dog trapped in com...
                                                                    105
     Not familiar with this breed. No tail (weird)...
2338
                                                                 14574
      Oh my. Here you are seeing an Adobe Setter giv...
2339
                                                                     80
     Can stand on stump for what seems like a while...
2340
                                                                    159
2341
     This appears to be a Mongolian Presbyterian mi...
                                                                    166
2342
     Here we have a well-established sunblockerspan...
                                                                    120
     Let's hope this flight isn't Malaysian (lol). ...
2343
                                                                    327
     Here we have a northern speckled Rhododendron...
2344
                                                                   153
     This is the happiest dog you will ever see. Ve...
2345
                                                                    486
     Here is the Rand Paul of retrievers folks! He'...
2346
                                                                    115
2347
     My oh my. This is a rare blond Canadian terrie...
                                                                    303
2348
     Here is a Siberian heavily armored polar bear ...
                                                                    446
2349
     This is an odd dog. Hard on the outside but lo...
                                                                   1240
2350
     This is a truly beautiful English Wilson Staff...
                                                                    135
2351 Here we have a 1949 1st generation vulpix. Enj...
                                                                    109
     This is a purebred Piers Morgan. Loves to Netf...
2352
                                                                    305
2353
     Here is a very happy pup. Big fan of well-main...
                                                                    126
     This is a western brown Mitsubishi terrier. Up...
                                                                    131
2355
     Here we have a Japanese Irish Setter. Lost eye...
                                                                   2528
     retweet_count
0
              8719
                NA
1
2
                NA
```

NA

NA

NA

NA

8	NA
9	NA
10	NA
11	5067
12	10264
13	4646
14	NA
15	NA
16	4607
17	NA
18	3673
19	NA
20	NA
21	NA
22	11913
23	18658
24	10612
25	NA
26	7940
27	NA
28	4561
29	NA
• • •	
2326	335
2327	42
2328	90
2329	95
2330	583
2331	NA
2332	144
2333	95 364
2334	364
2335	69
2336	79
2337 2338	36 6760
2339	14
2340	72
2341	76
2342	46
2343	172
2344	65
2345	226
2346	58
2347	144
2348	259
2349	867
2350	59
-	00

2351	40
2352	143
2353	46
2354	47
2355	52

[2356 rows x 3 columns]

1.2 2. Assessing

This step involves assessing the 3 datasets collected above (from 3 different sources) both visually and programmatically and find out quality and tidiness issues.

Visual Assessment

In [8]: twitter_archive

Out[8]:	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
5	891087950875897856	NaN	NaN
6	890971913173991426	NaN	NaN
7	890729181411237888	NaN	NaN
8	890609185150312448	NaN	NaN
9	890240255349198849	NaN	NaN
10	890006608113172480	NaN	NaN
11	889880896479866881	NaN	NaN
12	889665388333682689	NaN	NaN
13	889638837579907072	NaN	NaN
14	889531135344209921	NaN	NaN
15	889278841981685760	NaN	NaN
16	888917238123831296	NaN	NaN
17	888804989199671297	NaN	NaN
18	888554962724278272	NaN	NaN
19	888202515573088257	NaN	NaN
20	888078434458587136	NaN	NaN
21	887705289381826560	NaN	NaN
22	887517139158093824	NaN	NaN
23	887473957103951883	NaN	NaN
24	887343217045368832	NaN	NaN
25	887101392804085760	NaN	NaN
26	886983233522544640	NaN	NaN
27	886736880519319552	NaN	NaN
28	886680336477933568	NaN	NaN
29	886366144734445568	NaN	NaN

2326	666411507551481857	NaN	${\tt NaN}$
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
	666287406224695296		
2335		NaN	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 10:00:24 +0000		
	2017-07-29 00:08:17 +0000		
6			
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		
14	2017-07-24 17:02:04 +0000		

```
15
      2017-07-24 00:19:32 +0000
     2017-07-23 00:22:39 +0000
16
17
      2017-07-22 16:56:37 +0000
      2017-07-22 00:23:06 +0000
18
      2017-07-21 01:02:36 +0000
19
      2017-07-20 16:49:33 +0000
20
21
     2017-07-19 16:06:48 +0000
22
      2017-07-19 03:39:09 +0000
     2017-07-19 00:47:34 +0000
23
24
     2017-07-18 16:08:03 +0000
25
     2017-07-18 00:07:08 +0000
     2017-07-17 16:17:36 +0000
26
27
      2017-07-16 23:58:41 +0000
     2017-07-16 20:14:00 +0000
28
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
2331 2015-11-16 20:32:58 +0000
2332 2015-11-16 20:01:42 +0000
2333 2015-11-16 19:31:45 +0000
2334 2015-11-16 16:37:02 +0000
2335 2015-11-16 16:11:11 +0000
2336 2015-11-16 15:14:19 +0000
     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
2347 2015-11-16 00:55:59 +0000
2348 2015-11-16 00:49:46 +0000
2349 2015-11-16 00:35:11 +0000
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
```

source \

```
0
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
1
2
      <a href="http://twitter.com/download/iphone" r...</pre>
3
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
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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>
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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>
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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>
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      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
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      <a href="http://twitter.com/download/iphone" r...
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      <a href="http://twitter.com/download/iphone" r...</pre>
      <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>
      <a href="http://twitter.com/download/iphone" r...</pre>
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2337
      <a href="http://twitter.com/download/iphone" r...</pre>
      <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>
2342
      <a href="http://twitter.com/download/iphone" r...
```

```
2343
      <a href="http://twitter.com/download/iphone" r...
2344
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
2345
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      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
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      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
2349
      <a href="http://twitter.com/download/iphone" r...</pre>
2350
      <a href="http://twitter.com/download/iphone" r...</pre>
2351
      <a href="http://twitter.com/download/iphone" r...</pre>
2352
      <a href="http://twitter.com/download/iphone" r...</pre>
2353
2354
      <a href="http://twitter.com/download/iphone" r...</pre>
      <a href="http://twitter.com/download/iphone" r...</pre>
2355
                                                      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
      This is Archie. He is a rare Norwegian Pouncin...
2
                                                                             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
      Meet Jax. He enjoys ice cream so much he gets ...
6
                                                                             NaN
7
      When you watch your owner call another dog a g...
                                                                             NaN
      This is Zoey. She doesn't want to be one of th...
8
                                                                             NaN
9
      This is Cassie. She is a college pup. Studying...
                                                                             NaN
      This is Koda. He is a South Australian decksha...
10
                                                                             NaN
      This is Bruno. He is a service shark. Only get...
11
                                                                             NaN
      Here's a puppo that seems to be on the fence a...
12
                                                                             NaN
      This is Ted. He does his best. Sometimes that'...
13
                                                                             NaN
14
      This is Stuart. He's sporting his favorite fan...
                                                                             NaN
      This is Oliver. You're witnessing one of his m...
15
                                                                             NaN
16
      This is Jim. He found a fren. Taught him how t...
                                                                             NaN
      This is Zeke. He has a new stick. Very proud o...
17
                                                                             NaN
      This is Ralphus. He's powering up. Attempting ...
18
                                                                             NaN
      RT @dog_rates: This is Canela. She attempted s...
19
                                                                   8.874740e+17
      This is Gerald. He was just told he didn't get...
20
                                                                             NaN
      This is Jeffrey. He has a monopoly on the pool...
21
                                                                             NaN
22
      I've yet to rate a Venezuelan Hover Wiener. Th...
                                                                             NaN
      This is Canela. She attempted some fancy porch...
23
                                                                             NaN
      You may not have known you needed to see this ...
24
                                                                             NaN
25
      This... is a Jubilant Antarctic House Bear. We...
                                                                             NaN
26
      This is Maya. She's very shy. Rarely leaves he...
                                                                             NaN
27
      This is Mingus. He's a wonderful father to his...
                                                                             NaN
      This is Derek. He's late for a dog meeting. 13...
28
                                                                             NaN
      This is Roscoe. Another pupper fallen victim t...
29
                                                                             NaN
                                                                             . . .
2326
      This is quite the dog. Gets really excited whe...
                                                                             NaN
      This is a southern Vesuvius bumblegruff. Can d...
                                                                             NaN
```

```
Oh goodness. A super rare northeast Qdoba kang...
2328
                                                                           NaN
2329
     Those are sunglasses and a jean jacket. 11/10 ...
                                                                           NaN
2330
     Unique dog here. Very small. Lives in containe...
                                                                           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
      This is an Albanian 3 1/2 legged Episcopalian...
                                                                           NaN
2336
         Can take selfies 11/10 https://t.co/ws2AMaNwPW
                                                                           NaN
2337
     Very concerned about fellow dog trapped in com...
                                                                           NaN
      Not familiar with this breed. No tail (weird)...
2338
                                                                          {\tt 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
      Here we have a well-established sunblockerspan...
                                                                           NaN
2343
     Let's hope this flight isn't Malaysian (lol). ...
                                                                           NaN
2344
     Here we have a northern speckled Rhododendron...
                                                                          {\tt NaN}
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
2349
      This is an odd dog. Hard on the outside but lo...
                                                                           NaN
2350
     This is a truly beautiful English Wilson Staff...
                                                                           NaN
     Here we have a 1949 1st generation vulpix. Enj...
2351
                                                                           NaN
     This is a purebred Piers Morgan. Loves to Netf...
                                                                           NaN
2352
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
```

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```

			_			
•	rating_denominator	name		floofer	pupper	puppo
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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
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6	10	Jax	None	None	None	None
7	10	None	None	None	None	None
8	10	Zoey	None	None	None	None
9	10	Cassie	doggo	None	None	None
10	10	Koda	None	None	None	None
11	10	${ t Bruno}$	None	None	None	${\tt None}$
12	10	None	None	None	None	puppo
13	10	Ted	None	None	None	None
14	10	${ t Stuart}$	${\tt None}$	None	${\tt None}$	puppo
15	10	Oliver	${\tt None}$	None	${\tt None}$	${\tt None}$
16	10	Jim	${\tt None}$	None	None	None
17	10	Zeke	None	None	None	None
18	10	Ralphus	${\tt None}$	None	None	${\tt None}$
19	10	Canela	None	None	None	None
20	10	Gerald	None	None	None	None
21	10	Jeffrey	${\tt None}$	None	None	${\tt None}$
22	10	such	None	None	None	None
23	10	Canela	None	None	None	None
24	10	${\tt None}$	None	None	None	None
25	10	${\tt None}$	None	None	None	None
26	10	Maya	${\tt None}$	None	None	${\tt None}$
27	10	Mingus	None	None	None	None
28	10	Derek	None	None	None	None
29	10	Roscoe	None	None	pupper	None
2326	10	quite	None	None	None	None
2327	10	a	None	None	None	None
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2330	10	${\tt None}$	None	None	None	None

2331	10	None	None	None	None	None
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2344	10	None	None	None	None	None
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[2356 rows x 17 columns]

In [9]: image_pred

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6	1	box_turtle	0.933012	False
7	1	chow	0.692517	True
8	1	shopping_cart	0.962465	False
9	1	miniature_poodle	0.302400	True
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11	1	Gordon_setter	0.503672	True
12	1	Walker_hound	0.260857	True
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15	1	Lhasa	0.582330	True
16	1	English_setter	0.298617	True
17	1	hen	0.965932	False
18	1	desktop_computer	0.086502	False
19	1	Italian_greyhound	0.176053	True
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21	1	three-toed_sloth	0.914671	False
22	1	OX	0.416669	False
23	1	golden_retriever	0.858744	True
24	1	malamute	0.336874	True
25	1	guinea_pig	0.996496	False
26	1	soft-coated_wheaten_terrier	0.326467	True
27	1	Chihuahua	0.978108	True
28	1	black-and-tan_coonhound	0.529139	True
29	1	coho	0.404640	False
2045	1	French_bulldog	0.999201	True
2046	1	convertible	0.738995	False
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2048	2	Chihuahua	0.793469	True
2049	1	Samoyed	0.733942	True
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2051	2	Pembroke	0.809197	True
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2062	4	Pembroke	0.966327	Т
	1	1 CHIDI OKC	0.900321	True
2063	1	French_bulldog	0.377417	True

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2065
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                                    Pembroke
                                                           True
2066
            1
                               Irish_terrier
                                               0.487574
                                                           True
2067
            2
                                  Pomeranian
                                               0.566142
                                                           True
            1
2068
                                 Appenzeller
                                               0.341703
                                                           True
            1
                   Chesapeake_Bay_retriever
                                               0.425595
2069
                                                           True
            2
2070
                                       basset
                                               0.555712
                                                           True
2071
                                 paper_towel
                                               0.170278
                                                          False
            1
                                               0.716012
2072
                                   Chihuahua
                                                           True
2073
            1
                                   Chihuahua
                                               0.323581
                                                           True
2074
            1
                                               0.097049
                                                          False
                                       orange
                                                                                p3 \
                              p2
                                   p2_conf p2_dog
0
                         collie
                                  0.156665
                                              True
                                                               Shetland_sheepdog
            miniature_pinscher
                                  0.074192
1
                                              True
                                                             Rhodesian_ridgeback
2
                       malinois
                                  0.138584
                                              True
                                                                       bloodhound
3
                        redbone
                                  0.360687
                                              True
                                                              miniature_pinscher
4
                     Rottweiler
                                  0.243682
                                              True
                                                                         Doberman
5
               English_springer
                                  0.263788
                                              True
                                                      Greater_Swiss_Mountain_dog
6
                     mud_turtle
                                  0.045885
                                             False
                                                                         terrapin
7
                Tibetan_mastiff
                                  0.058279
                                              True
                                                                         fur_coat
8
                shopping_basket
                                  0.014594
                                             False
                                                                 golden_retriever
9
                       komondor
                                  0.192305
                                              True
                                                     soft-coated_wheaten_terrier
                Tibetan_mastiff
                                  0.093718
10
                                              True
                                                              Labrador_retriever
11
             Yorkshire_terrier
                                  0.174201
                                              True
                                                                         Pekinese
12
               English_foxhound
                                  0.175382
                                              True
                                                                     Ibizan_hound
                   bull_mastiff
                                              True
13
                                  0.404722
                                                                   French_bulldog
14
                German_shepherd
                                  0.078260
                                              True
                                                                         malinois
                       Shih-Tzu
                                  0.166192
                                                                   Dandie Dinmont
15
                                              True
16
                   Newfoundland
                                  0.149842
                                              True
                                                                           borzoi
17
                                  0.033919
                                             False
                                                                        partridge
                            cock
18
                                  0.085547
                                             False
                                                                         bookcase
                            desk
19
                    toy_terrier
                                  0.111884
                                              True
                                                                          basenji
20
                                  0.063064
                                                                miniature_poodle
                     toy_poodle
                                              True
21
                                  0.015250
                                             False
                                                                   great_grey_owl
                           otter
22
                   Newfoundland
                                  0.278407
                                              True
                                                                      groenendael
23
      Chesapeake_Bay_retriever
                                  0.054787
                                              True
                                                              Labrador_retriever
24
                 Siberian_husky
                                  0.147655
                                                                       Eskimo_dog
                                              True
25
                                  0.002402
                                                                          hamster
                           skunk
                                             False
26
                   Afghan_hound
                                  0.259551
                                              True
                                                                           briard
27
                                  0.009397
                    toy_terrier
                                              True
                                                                         papillon
28
                     bloodhound
                                  0.244220
                                              True
                                                           flat-coated_retriever
29
                                  0.271485
                                             False
                                                                               gar
                     barracouta
. . .
                                        . . .
                                               . . .
                                                                               . . .
2045
                      Chihuahua
                                 0.000361
                                              True
                                                                      Boston_bull
2046
                     sports_car
                                  0.139952
                                             False
                                                                        car wheel
2047
                 Great_Pyrenees
                                  0.186136
                                              True
                                                                   Dandie_Dinmont
2048
                    toy_terrier
                                  0.143528
                                              True
                                                                       can_opener
```

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

p3_conf p3_dog 0 0.061428 True 1 0.072010 True 2 0.116197 True 3 0.222752 True 0.154629 4 True 5 0.016199 True 6 0.017885 False 7 0.054449 False 8 0.007959 True 0.082086 9 True 0.072427 10 True 11 0.109454 True 12 0.097471 True 13 0.048960 True 0.075628 14 True 15 0.089688 True 16 0.133649 True 0.000052 17 False 18 0.079480 False 19 0.111152 True

```
20
              0.025581
                         True
        21
              0.013207
                        False
              0.102643
        22
                         True
        23
              0.014241
                         True
              0.093412
        24
                         True
        25
              0.000461
                        False
        26
              0.206803
                         True
        27
              0.004577
                         True
        28
              0.173810
                         True
              0.189945 False
        29
        . . .
             0.000076
        2045
                         True
             0.044173
        2046
                        False
              0.086346
        2047
                         True
              0.032253
        2048
                        False
        2049
              0.029705
                         True
        2050
              0.134203
                         True
              0.038915
        2051
                         True
        2052
             0.026321
                        False
        2053
             0.026236
                         True
        2054
             0.000903
                         True
              0.038915
        2055
                         True
        2056
             0.111411
                         True
        2057
              0.073482
                         True
        2058
             0.105506
                         True
              0.027351
        2059
                         True
             0.007958
        2060
                         True
             0.001498
        2061
                         True
        2062
              0.004633
                         True
        2063
             0.082981
                        False
        2064
              0.008167
                         True
        2065
              0.029248
                         True
        2066
             0.118184
                         True
        2067
              0.076507
                         True
             0.193548
        2068
                        False
        2069
              0.076902
                        False
             0.175219
        2070
                         True
        2071 0.040836
                        False
        2072 0.031379
                         True
        2073
              0.068957
                         True
        2074
             0.076110 False
        [2075 rows x 12 columns]
In [10]: tweet_json = df
         tweet_json
Out[10]:
                                                              text favorite_count \
         0
               This is Phineas. He's a mystical boy. Only eve...
                                                                            39164
```

1	N.	A NA
2	N.	A NA
3	This is Darla. She commenced a snooze mid meal	. 42534
4	N.	A NA
5	N.	A NA
6	N.	A NA
7	N.	A NA
8	N.	A NA
9	N.	A NA
10	N.	A NA
11	This is Bruno. He is a service shark. Only get	. 28037
12	Here's a puppo that seems to be on the fence a	. 48329
13	This is Ted. He does his best. Sometimes that'	. 27427
14	N.	A NA
15	N.	
16	This is Jim. He found a fren. Taught him how t	. 29345
17	N.	
18	This is Ralphus. He's powering up. Attempting	. 20115
19	N.	
20	N.	
21	N.	
22	I've yet to rate a Venezuelan Hover Wiener. Th	
23	This is Canela. She attempted some fancy porch	
24	You may not have known you needed to see this	
25	N.	
26	This is Maya. She's very shy. Rarely leaves he	
27	N.	
28	This is Derek. He's late for a dog meeting. 13	
29	N.	A NA
2326	This is suite the dear Cots morelly excited the	. 453
2327	This is quite the dog. Gets really excited whe	
2328	This is a southern Vesuvius bumblegruff. Can d Oh goodness. A super rare northeast Qdoba kang	
2329	Those are sunglasses and a jean jacket. 11/10	
2330	Unique dog here. Very small. Lives in containe	
2331	N.	
2332	Look at this jokester thinking seat belt laws	
2333	This is an extremely rare horned Parthenon. No	
2334	This is a funny dog. Weird toes. Won't come do	
2335	This is an Albanian 3 1/2 legged Episcopalian	
2336	Can take selfies 11/10 https://t.co/ws2AMaNwP	
2337	Very concerned about fellow dog trapped in com	
2338	Not familiar with this breed. No tail (weird)	14574
2339	Oh my. Here you are seeing an Adobe Setter giv	
2340	Can stand on stump for what seems like a while	
2341	This appears to be a Mongolian Presbyterian mi	
2342	Here we have a well-established sunblockerspan	
2343	Let's hope this flight isn't Malaysian (lol)	. 327

2344	Here we have a northern speckled Rhododendron	153
2345	This is the happiest dog you will ever see. Ve	486
2346	Here is the Rand Paul of retrievers folks! He'	115
2347	My oh my. This is a rare blond Canadian terrie	303
2348	Here is a Siberian heavily armored polar bear	446
2349	This is an odd dog. Hard on the outside but lo	1240
2350	This is a truly beautiful English Wilson Staff	135
2351	Here we have a 1949 1st generation vulpix. Enj	109
2352	This is a purebred Piers Morgan. Loves to Netf	305
2353	Here is a very happy pup. Big fan of well-main	126
2354	This is a western brown Mitsubishi terrier. Up	131
2355	Here we have a Japanese Irish Setter. Lost eve	2528

retweet_count NANANANANANA NANANA NANANANA NANANANANA.

2329	95
2330	583
2331	NA
2332	144
2333	95
2334	364
2335	69
2336	79
2337	36
2338	6760
2339	14
2340	72
2341	76
2342	46
2343	172
2344	65
2345	226
2346	58
2347	144
2348	259
2349	867
2350	59
2351	40
2352	143
2353	46
2354	47
2355	52

[2356 rows x 3 columns]

Programmatic Assessment

```
In [11]: 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 in_reply_to_status_id 78 non-null float64 in_reply_to_user_id 78 non-null float64 timestamp 2356 non-null object source 2356 non-null object 2356 non-null object text retweeted_status_id 181 non-null float64 181 non-null float64 retweeted_status_user_id ${\tt retweeted_status_timestamp}$ 181 non-null object 2297 non-null object expanded_urls 2356 non-null int64 rating_numerator

```
rating_denominator
                              2356 non-null int64
name
                              2356 non-null object
                              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 [12]: image_pred.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2075 entries, 0 to 2074
Data columns (total 12 columns):
tweet_id
            2075 non-null int64
            2075 non-null object
jpg_url
            2075 non-null int64
img_num
            2075 non-null object
р1
            2075 non-null float64
p1_conf
            2075 non-null bool
p1_dog
            2075 non-null object
p2
            2075 non-null float64
p2_conf
p2_dog
            2075 non-null bool
Вq
            2075 non-null object
p3_conf
            2075 non-null float64
            2075 non-null bool
p3_dog
dtypes: bool(3), float64(3), int64(2), object(4)
memory usage: 152.0+ KB
In [13]: tweet_json.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2356 entries, 0 to 2355
Data columns (total 3 columns):
                  2356 non-null object
text
favorite_count
                  2356 non-null object
retweet_count
                  2356 non-null object
dtypes: object(3)
memory usage: 55.3+ KB
In [14]: twitter_archive.doggo.value_counts()
Out[14]: None
                  2259
                    97
         doggo
         Name: doggo, dtype: int64
In [15]: twitter_archive.floofer.value_counts()
```

```
Out[15]: None
                    2346
         floofer
                      10
         Name: floofer, dtype: int64
In [16]: twitter_archive.pupper.value_counts()
Out[16]: None
                   2099
                    257
         pupper
         Name: pupper, dtype: int64
In [17]: twitter_archive.puppo.value_counts()
Out[17]: None
                  2326
         puppo
                    30
         Name: puppo, dtype: int64
In [18]: image_pred.p1.unique()
Out[18]: array(['Welsh_springer_spaniel', 'redbone', 'German_shepherd',
                'Rhodesian_ridgeback', 'miniature_pinscher', 'Bernese_mountain_dog',
                'box_turtle', 'chow', 'shopping_cart', 'miniature_poodle',
                'golden_retriever', 'Gordon_setter', 'Walker_hound', 'pug',
                'bloodhound', 'Lhasa', 'English_setter', 'hen', 'desktop_computer',
                'Italian_greyhound', 'Maltese_dog', 'three-toed_sloth', 'ox',
                'malamute', 'guinea_pig', 'soft-coated_wheaten_terrier',
                'Chihuahua', 'black-and-tan_coonhound', 'coho', 'toy_terrier',
                'Blenheim_spaniel', 'Pembroke', 'llama', 'Chesapeake_Bay_retriever',
                'curly-coated_retriever', 'dalmatian', 'Ibizan_hound',
                'Border_collie', 'Labrador_retriever', 'seat_belt', 'snail',
                'miniature_schnauzer', 'Airedale', 'triceratops', 'swab', 'hay',
                'hyena', 'jigsaw_puzzle', 'West_Highland_white_terrier',
                'toy_poodle', 'giant_schnauzer', 'vizsla', 'vacuum', 'Rottweiler',
                'Siberian_husky', 'teddy', 'papillon', 'Saint_Bernard', 'porcupine',
                'goose', 'Tibetan_terrier', 'borzoi', 'beagle', 'hare',
                'Yorkshire_terrier', 'Pomeranian', 'electric_fan', 'web_site',
                'ibex', 'kuvasz', 'fire_engine', 'lorikeet',
                'flat-coated_retriever', 'toyshop', 'common_iguana',
                'Norwegian_elkhound', 'frilled_lizard', 'leatherback_turtle',
                'hamster', 'Angora', 'Arctic_fox', 'trombone', 'canoe',
                'king_penguin', 'shopping_basket', 'standard_poodle',
                'Staffordshire_bullterrier', 'basenji', 'Lakeland_terrier',
                'American_Staffordshire_terrier', 'bearskin', 'Shih-Tzu', 'bustard',
                'crash_helmet', 'French_bulldog', 'Pekinese', 'komondor',
                'ski_mask', 'malinois', 'kelpie', 'Brittany_spaniel',
                'cocker_spaniel', 'shower_curtain', 'basset', 'jellyfish',
                'doormat', 'Arabian_camel', 'lynx', 'hog', 'comic_book', 'minivan',
                'seashore', 'cuirass', 'Brabancon_griffon', 'candle', 'Eskimo_dog',
                'weasel', 'Christmas_stocking', 'washbasin', 'car_mirror',
                'piggy_bank', 'pot', 'boathouse', 'mud_turtle',
```

```
'German_short-haired_pointer', 'Shetland_sheepdog', 'Irish_terrier',
'cairn', 'platypus', 'English_springer', 'whippet',
'ping-pong_ball', 'sea_urchin', 'bow_tie', 'window_shade',
"jack-o'-lantern", 'sorrel', 'Sussex_spaniel', 'peacock', 'axolotl',
'wool', 'banana', 'Dandie_Dinmont', 'Norwich_terrier',
'wood_rabbit', 'dhole', 'keeshond', 'Norfolk_terrier', 'lacewing',
'dingo', 'brown_bear', 'Old_English_sheepdog', 'scorpion',
'flamingo', 'microphone', 'Samoyed', 'pitcher',
'African_hunting_dog', 'refrigerator', 'picket_fence', 'tub',
'zebra', 'hermit_crab', 'swing', 'Doberman', 'park_bench',
'feather_boa', 'Loafer', 'stone_wall', 'ice_bear', 'prayer_rug',
'chimpanzee', 'china_cabinet', 'bee_eater', 'tennis_ball', 'carton',
'killer_whale', 'ostrich', 'terrapin', 'Siamese_cat', 'gondola',
'Great_Pyrenees', 'microwave', 'starfish', 'sandbar', 'tusker',
'motor_scooter', 'ram', 'leaf_beetle', 'wombat', 'schipperke',
'Newfoundland', 'bull_mastiff', 'water_bottle', 'suit',
'toilet_seat', 'collie', 'robin', 'Cardigan',
'Greater_Swiss_Mountain_dog', 'slug', 'toilet_tissue',
'acorn_squash', 'soccer_ball', 'African_crocodile', 'tick',
'ocarina', 'boxer', 'street_sign', 'bow', 'stove', 'paper_towel',
'upright', 'dough', 'Scottish_deerhound', 'bath_towel',
'standard_schnauzer', 'walking_stick', 'Irish_water_spaniel',
'bubble', 'Boston_bull', 'book_jacket', 'rain_barrel',
'black-footed_ferret', 'guenon', 'Japanese_spaniel',
'water_buffalo', 'patio', 'cowboy_hat', 'dogsled', 'maze', 'harp',
'panpipe', 'cash_machine', 'mailbox', 'wallaby', 'EntleBucher',
'earthstar', 'pillow', 'bluetick', 'space_heater', 'carousel',
'Irish_setter', 'birdhouse', 'snorkel', 'bald_eagle', 'koala',
'Leonberg', 'cheetah', 'minibus', 'Weimaraner', 'clog',
'dishwasher', 'white_wolf', 'sliding_door', 'damselfly',
'Great_Dane', 'Tibetan_mastiff', 'cheeseburger', 'fiddler_crab',
'bannister', 'crane', 'Scotch_terrier', 'snowmobile', 'badger',
'bighorn', 'geyser', 'barrow', 'bison', 'Mexican_hairless',
'ice_lolly', 'sea_lion', 'dining_table', 'groenendael',
'Australian_terrier', 'beaver', 'briard', 'Appenzeller', 'grey_fox',
'mousetrap', 'hippopotamus', 'Border_terrier', 'hummingbird',
'tailed_frog', 'otter', 'Egyptian_cat', 'four-poster', 'wild_boar',
'bathtub', 'agama', 'muzzle', 'hotdog', 'bib', 'espresso',
'timber_wolf', 'meerkat', 'nail', 'hammer', 'home_theater', 'alp',
'bonnet', 'handkerchief', 'hand_blower', 'polecat', 'lakeside',
'studio_couch', 'cup', 'cliff', 'Bedlington_terrier', 'lawn_mower',
'balloon', 'sunglasses', 'rapeseed', 'traffic_light', 'coil',
'binoculars', 'paddle', 'tiger_shark', 'sulphur-crested_cockatoo',
'wire-haired_fox_terrier', 'Saluki', 'American_black_bear',
'rotisserie', 'conch', 'skunk', 'bookshop', 'radio_telescope',
'cougar', 'African_grey', 'coral_reef', 'lion', 'maillot',
'Madagascar_cat', 'tabby', 'silky_terrier', 'giant_panda',
'long-horned_beetle', 'Afghan_hound', 'clumber', 'sundial',
```

```
'restaurant', 'prison', 'school_bus', 'cowboy_boot', 'jersey',
                'wooden_spoon', 'leopard', 'mortarboard', 'teapot',
                'military_uniform', 'washer', 'coffee_mug', 'fountain',
                'pencil_box', 'barbell', 'grille', 'revolver', 'envelope',
                'syringe', 'marmot', 'pole', 'laptop', 'basketball', 'tricycle',
                'convertible', 'limousine', 'orange'], dtype=object)
In [19]: image_pred.p2.unique()
Out[19]: array(['collie', 'miniature_pinscher', 'malinois', 'redbone', 'Rottweiler',
                'English_springer', 'mud_turtle', 'Tibetan_mastiff',
                'shopping_basket', 'komondor', 'Yorkshire_terrier',
                'English_foxhound', 'bull_mastiff', 'German_shepherd', 'Shih-Tzu',
                'Newfoundland', 'cock', 'desk', 'toy_terrier', 'toy_poodle',
                'otter', 'Chesapeake_Bay_retriever', 'Siberian_husky', 'skunk',
                'Afghan_hound', 'bloodhound', 'barracouta', 'papillon',
                'cocker_spaniel', 'chow', 'Irish_terrier', 'chain_saw', 'beagle',
                'giant_schnauzer', 'Labrador_retriever', 'Pembroke', 'Chihuahua',
                'Weimaraner', 'slug', 'Brittany_spaniel', 'standard_schnauzer',
                'teddy', 'armadillo', 'African_hunting_dog', 'vizsla', 'doormat',
                'pug', 'Italian_greyhound', 'Samoyed', 'Pomeranian',
                'miniature_poodle', 'Lakeland_terrier', 'Irish_setter', 'swab',
                'malamute', 'bath_towel', 'Border_collie', 'Leonberg', 'drake',
                'French_bulldog', 'ice_bear', 'Christmas_stocking',
                'golden_retriever', 'standard_poodle', 'dhole', 'kuvasz',
                'Cardigan', 'silky_terrier', 'spotlight', 'dishwasher', 'bighorn',
                'tow_truck', 'hummingbird', 'English_setter', 'prayer_rug',
                'frilled_lizard', 'Pekinese', 'ox', 'boxer', 'hog', 'guinea_pig',
                'hen', 'wallaby', 'cowboy_boot', 'cornet', 'minivan', 'paddle',
                'basset', 'hamper', 'Bedlington_terrier', 'Shetland_sheepdog',
                'bow', 'Lhasa', 'pelican', 'toaster', 'groenendael',
                'Australian_terrier', 'llama', 'knee_pad', 'pillow', 'Ibizan_hound',
                'Old_English_sheepdog', 'Welsh_springer_spaniel', 'coral_reef',
                'bison', 'waffle_iron', 'tabby', 'bib', 'police_van', 'Eskimo_dog',
                'breastplate', 'German_short-haired_pointer', 'Norfolk_terrier',
                'Blenheim_spaniel', 'pickup', 'miniature_schnauzer', 'lampshade',
                'Tibetan_terrier', 'Siamese_cat', 'borzoi', 'studio_couch',
                'toilet_seat', 'hamster', 'seat_belt', 'keeshond', 'koala',
                'hair_spray', 'Saint_Bernard', 'tray',
                'American_Staffordshire_terrier', 'birdhouse', 'terrapin',
                'Staffordshire_bullterrier', 'briard',
                'West_Highland_white_terrier', 'spotted_salamander', 'tennis_ball',
                'porcupine', 'cardigan', 'corn', 'basenji', 'otterhound',
                'European_gallinule', 'indri', 'tailed_frog', 'beach_wagon',
                'siamang', 'orange', 'home_theater', 'cairn', 'hare',
                'Norwegian_elkhound', 'Brabancon_griffon', 'American_black_bear',
```

'padlock', 'pool_table', 'quilt', 'beach_wagon', 'remote_control', 'bakery', 'pedestal', 'gas_pump', 'bookcase', 'shield', 'loupe',

```
'sulphur_butterfly', 'Sealyham_terrier', 'Walker_hound',
'tarantula', 'Persian_cat', 'coral_fungus', 'accordion', 'kelpie',
'Great_Pyrenees', 'wood_rabbit', 'black-and-tan_coonhound',
'sunglasses', 'plow', 'whippet', 'rain_barrel', 'bathtub', 'tiger',
'snail', 'tick', 'wire-haired_fox_terrier', 'water_bottle', 'wig',
'platypus', 'Irish_wolfhound', 'ram', 'gorilla',
'entertainment_center', 'toucan', 'mask', 'shopping_cart',
'Sussex_spaniel', 'crate', 'grey_whale', 'badger', 'Airedale',
'Arabian_camel', 'cockroach', 'lifeboat', 'rotisserie', 'goldfish',
'stingray', 'warthog', 'bobsled', 'rhinoceros_beetle', 'beaver',
'brown_bear', 'Maltese_dog', 'weasel', 'quill',
'Rhodesian_ridgeback', 'Arctic_fox', 'ashcan', 'bow_tie',
'soft-coated_wheaten_terrier', 'schipperke', 'bearskin',
'Kerry_blue_terrier', 'ice_lolly', 'American_alligator',
'mosquito_net', 'sea_lion', 'Boston_bull', 'nail',
'black-footed_ferret', 'promontory', 'sarong', 'Doberman',
'space_heater', 'Great_Dane', 'mailbox', 'Saluki', 'bakery',
'sandal', 'leafhopper', 'barrel', 'water_buffalo', 'polecat',
'macaque', 'Japanese_spaniel', 'folding_chair', 'trench_coat',
'Angora', 'junco', 'crib', 'dalmatian', 'snowmobile',
'flat-coated_retriever', 'streetcar', 'window_screen', 'bannister',
'hair_slide', 'meerkat', 'cannon', 'jaguar', 'Border_terrier',
'Greater_Swiss_Mountain_dog', 'hay', 'apron', 'cloak', 'radiator',
'muzzle', 'feather_boa', 'rifle', 'chimpanzee', 'loggerhead',
'torch', 'Mexican_hairless', 'spindle', 'triceratops',
'Appenzeller', 'stove', 'dingo', 'oscilloscope', 'common_newt',
'hotdog', 'medicine_chest', 'quail', 'horse_cart', 'four-poster',
'pier', 'red_fox', 'affenpinscher', 'assault_rifle',
'mashed_potato', 'moped', 'hyena', 'seashore', 'tub', 'sports_car',
'swing', 'mink', 'bluetick', 'neck_brace', 'grey_fox', 'mongoose',
'fur_coat', 'Scotch_terrier', 'spatula', 'paper_towel', 'shoji',
'toyshop', 'banded_gecko', 'peacock', 'crossword_puzzle',
'tree_frog', 'wombat', 'turnstile', 'sleeping_bag', 'quilt',
'Gila_monster', 'giant_panda', 'Dandie_Dinmont', 'handkerchief',
'sombrero', 'Indian_elephant', 'coffee_mug', 'gibbon', 'carton',
'screw', 'minibus', 'hatchet', 'window_shade', 'lawn_mower',
'washbasin', 'sock', 'prison', 'patio', 'china_cabinet',
'chain_mail', 'breakwater', 'computer_keyboard', 'goose',
'lakeside', 'solar_dish', 'table_lamp', 'Windsor_tie',
'punching_bag', 'comic_book', 'sunglass', 'great_white_shark',
'timber_wolf', 'fountain', 'dugong', 'marmot', 'barbershop',
'shovel', 'curly-coated_retriever', 'lesser_panda', 'monitor',
'crutch', 'cash_machine', 'printer', 'volcano', 'wallet', 'laptop',
'bathing_cap', 'confectionery', 'dam', 'killer_whale', 'canoe',
'Madagascar_cat', 'jean', 'boathouse', 'cliff', 'maillot', 'iPod',
'hand-held_computer', 'black_widow', 'Norwich_terrier', 'necklace',
'dining_table', 'binoculars', 'cradle', 'sea_urchin', 'cougar',
'EntleBucher', 'basketball', 'lighter', 'saltshaker', 'harvester',
```

```
'shower_curtain', 'cab', 'snorkel', 'jigsaw_puzzle', 'sweatshirt',
                'white_wolf', 'sliding_door', 'academic_gown', 'cowboy_hat',
                'can_opener', 'cup', 'rule', 'soccer_ball', 'bucket', 'racket',
                'menu', 'purse', 'Bernese_mountain_dog', 'dumbbell', 'projectile',
                'dock', 'oxygen_mask', 'sandbar', 'umbrella', 'shower_cap', 'bagel'], dtype=obje
In [20]: image_pred.p3.unique()
Out[20]: array(['Shetland_sheepdog', 'Rhodesian_ridgeback', 'bloodhound',
                'miniature_pinscher', 'Doberman', 'Greater_Swiss_Mountain_dog',
                'terrapin', 'fur_coat', 'golden_retriever',
                'soft-coated_wheaten_terrier', 'Labrador_retriever', 'Pekinese',
                'Ibizan_hound', 'French_bulldog', 'malinois', 'Dandie_Dinmont',
                'borzoi', 'partridge', 'bookcase', 'basenji', 'miniature_poodle',
                'great_grey_owl', 'groenendael', 'Eskimo_dog', 'hamster', 'briard',
                'papillon', 'flat-coated_retriever', 'gar', 'Chihuahua', 'Shih-Tzu',
                'Pomeranian', 'dingo', 'power_drill', 'Saluki', 'Great_Pyrenees',
                'West_Highland_white_terrier', 'collie', 'toy_poodle', 'vizsla',
                'acorn', 'giant_schnauzer', 'teddy', 'common_iguana', 'wig',
                'water_buffalo', 'coyote', 'seat_belt', 'kelpie', 'space_heater',
                'Brabancon_griffon', 'standard_poodle', 'beagle',
                'Irish_water_spaniel', 'bluetick', 'Weimaraner',
                'Chesapeake_Bay_retriever', 'toilet_tissue',
                'black-and-tan_coonhound', 'kuvasz', 'Christmas_stocking', 'badger',
                'hen', 'Staffordshire_bullterrier', 'Yorkshire_terrier',
                'Lakeland_terrier', 'weasel', 'ski_mask', 'cocker_spaniel',
                'Australian_terrier', 'lampshade', 'oscilloscope', 'ram', 'jeep',
                'ice_bear', 'African_grey', 'Great_Dane', 'curly-coated_retriever',
                'doormat', 'African_chameleon', 'schipperke', 'muzzle',
                'triceratops', 'Newfoundland', 'Band_Aid', 'wood_rabbit',
                'white_wolf', 'giant_panda', 'Welsh_springer_spaniel',
                'French_horn', 'toy_terrier', 'Pembroke', 'Cardigan', 'bassinet',
                'pug', 'Afghan_hound', 'American_Staffordshire_terrier', 'whippet',
                'English_setter', 'panpipe', 'crane', 'mouse', 'titi', 'Angora',
                'Boston_bull', 'silky_terrier', 'Japanese_spaniel', 'sandbar',
                'balance_beam', 'black-footed_ferret', 'miniature_schnauzer',
                'Blenheim_spaniel', 'bathtub', 'Saint_Bernard', 'redbone',
                'goldfish', 'Norfolk_terrier', 'llama', 'koala', 'pillow', 'jersey',
                'chow', 'minibus', 'malamute', 'bulletproof_vest', 'beach_wagon',
                'cairn', 'plunger', 'paper_towel', 'wing', 'English_foxhound',
                'Brittany_spaniel', 'bolete', 'ashcan', 'box_turtle', 'guinea_pig',
                'bison', 'bull_mastiff', 'racket', 'cardoon', 'Tibetan_mastiff',
                'window_screen', 'Irish_terrier', 'agama', 'common_newt',
                'car_wheel', 'gorilla', 'bagel', 'clumber', 'Egyptian_cat',
                'television', 'boxer', 'brown_bear', 'leafhopper',
                'German_shepherd', 'Border_collie', 'menu', 'wolf_spider',
                'bathing_cap', 'stinkhorn', 'drumstick', 'mask',
```

'television', 'envelope', 'house_finch', 'web_site', 'palace',

```
'Scottish_deerhound', 'shower_curtain', 'Appenzeller',
'plastic_bag', 'swimming_trunks', 'prairie_chicken', 'red_wolf',
'Maltese_dog', 'snail', 'gibbon', 'Gordon_setter', 'black_swan',
'beacon', 'wool', 'cowboy_boot', 'Rottweiler', 'poncho', 'swing',
'Arctic_fox', 'bib', 'Italian_greyhound', 'steam_locomotive',
'fountain', 'chickadee', 'abaya', 'Border_terrier', 'bubble',
'chimpanzee', 'hammerhead', 'Norwegian_elkhound', 'Norwich_terrier',
'Airedale', 'Siamese_cat', 'sea_cucumber', 'seashore', 'nipple',
'moped', 'Arabian_camel', 'crayfish', 'wallaby',
'wire-haired_fox_terrier', 'toilet_seat', 'Old_English_sheepdog',
'pajama', 'Walker_hound', 'shovel', 'bucket', 'Sealyham_terrier',
'Windsor_tie', 'Siberian_husky', 'quill', 'Persian_cat',
'European_fire_salamander', 'three-toed_sloth', 'swab', 'echidna',
'tennis_ball', 'Lhasa', 'coral_reef', 'keeshond', 'mink', 'screw',
'basset', 'wreck', 'kimono', 'German_short-haired_pointer',
'joystick', 'microwave', 'Tibetan_terrier', 'Irish_wolfhound',
'Samoyed', 'loggerhead', 'French_loaf', 'Irish_setter', 'komondor',
'purse', 'greenhouse', 'broccoli', 'shopping_basket', 'macaque',
'squirrel_monkey', 'green_lizard', 'parallel_bars', 'cloak',
'chest', 'sundial', 'mosquito_net', 'bath_towel', 'cuirass',
'zebra', 'lumbermill', 'wallet', 'feather_boa', 'English_springer',
'electric_fan', 'hippopotamus', 'ox', 'quilt', 'assault_rifle',
'axolotl', 'pot', 'toyshop', 'pizza', 'scuba_diver', 'beaver',
'Mexican_hairless', 'cliff', 'loupe', 'wild_boar', 'jaguar', 'hog',
'polecat', 'lion', 'EntleBucher', 'hand-held_computer', 'washbasin',
'whiptail', 'rock_crab', 'hare', 'shoji', 'sombrero', 'bell_cote',
'rifle', 'goose', 'pickup', 'sunglasses', 'limousine', 'bow_tie',
'pretzel', 'marmot', 'ice_lolly', 'vacuum', 'dalmatian', 'prison',
'shower_cap', 'sliding_door', 'dugong', 'otterhound', 'eel',
'binder', 'bullfrog', 'soap_dispenser', 'sea_lion', 'carton',
'brass', 'mitten', 'golfcart', 'cougar', 'warthog', 'umbrella',
'neck_brace', 'cup', 'book_jacket', 'padlock', 'cab', 'chime',
'Leonberg', 'viaduct', 'American_black_bear', 'tub', 'hand_blower',
'king_penguin', 'rotisserie', 'bannister', 'passenger_car',
'mongoose', 'dhole', 'consomme', 'valley', 'park_bench', 'mushroom',
'barrow', 'parachute', 'desktop_computer', 'snorkel', 'wok',
'affenpinscher', 'space_shuttle', 'rain_barrel', 'ballplayer',
'mountain_tent', 'oxcart', 'buckeye', 'sunglass', 'croquet_ball',
'refrigerator', 'snow_leopard', 'tripod', 'rapeseed', 'tiger_cat',
'Bernese_mountain_dog', 'notebook', 'maraca', 'pool_table',
'lakeside', 'theater_curtain', 'pier', 'cheetah', 'mousetrap',
'pop_bottle', 'soccer_ball', 'wombat', 'rhinoceros_beetle',
'paddlewheel', 'paintbrush', 'maze', 'hatchet', 'chain',
'jigsaw_puzzle', 'switch', 'Kerry_blue_terrier', 'barbell',
'convertible', 'entertainment_center', 'file', 'guillotine', 'nail',
'standard_schnauzer', 'bow', 'grocery_store', 'boathouse', 'conch',
'Bouvier_des_Flandres', 'grey_fox', 'shopping_cart', 'meerkat',
'grand_piano', 'envelope', 'screen', 'coffeepot', 'printer',
```

```
'otter', 'restaurant', 'bonnet', 'crossword_puzzle', 'go-kart',
                'Sussex_spaniel', 'orangutan', 'canoe', 'barber_chair',
                'traffic_light', 'ibex', 'can_opener', 'Indian_elephant', 'spatula',
                'banana'], dtype=object)
In [21]: image_pred.p1_dog.value_counts()
Out[21]: True
                  1532
         False
                   543
         Name: p1_dog, dtype: int64
In [22]: image_pred.p2_dog.value_counts()
Out[22]: True
                  1553
         False
                   522
         Name: p2_dog, dtype: int64
In [23]: image_pred.p3_dog.value_counts()
Out[23]: True
                  1499
        False
                   576
        Name: p3_dog, dtype: int64
```

Quality issues 'twitter_archive' table

- tweet_id column should be of object type, not integer.
- Missing values in 'in_reply_to_status_id', 'in_reply_to_user_id', 'retweeted_status_id','retweeted_status_user_id', and 'retweeted_status_timestamp' columns can instead be left as null or filled with new values.
- 'timestamp' and 'retweeted_status_timestamp' are of object type instead of datetime.
- We only want to deal with non retweet tweets, hence the first rows where retweeted_status_id, retweeted_status_user_id, and retweeted_status_timestamp are not empty, must be removed.
- The columns doggo, floofer, pupper and puppo can be converted to have true/false values instead of None values.

'tweet_json' table

- Missing values in 'favorite_count' and 'retweet_count' columns. They can be left as null, or added with new values.
- 'favorite_count' and 'retweet_count' are object type and should be converted to numeric type.

'image_pred' table

- Nondescriptive column headers p1, p2, p3, p1_conf, p2_conf, p3_conf, p1_dog, p2_dog, p3_dog.
- The columns p1,p2 and p3 are various breeds of dogs and hence must be categorical instead of object type.
- The columns p1_dog, p2_dog and p3_dog must be of type bool.
- The columns 'p1', 'p2', 'p3' represent things which are not dogs. We can use False values in p1_dog, p2_dog and p3_dog to remove these non dog entries.

1.2.1 Tidiness issues

- All the 3 tables namely 'twitter_archive', 'image_pred' and 'tweet_json' have the same observational unit 'tweet_id'.
- The rating_numerator and rating_denominator must be combined into single column Overall_rating.

2 Cleaning

2.0.1 Define

• Combine all the 3 tables 'twitter_archive', 'image_pred' and 'tweet_json' into a single table.

In [24]: # Create a copy of the dataset before cleaning

2.0.2 Code

```
df_clean = twitter_archive.copy()
         # Add 2 new columns favorite_count and retweet_count to twitter_archive from tweet_jsor
         df_clean['favorite_count'] = tweet_json.favorite_count
         df_clean['retweet_count'] = tweet_json.retweet_count
         # Now join all the columns of 'image_pred' to df_clean
         df2_clean = pd.merge(df_clean,
                             image_pred,
                             left_on='tweet_id',
                             right_on='tweet_id',
                             how='right')
2.0.3 Test
In [25]: df2_clean.head()
Out[25]:
                      tweet_id in_reply_to_status_id in_reply_to_user_id \
         0 892420643555336193
                                                  NaN
                                                                       NaN
         1 892177421306343426
                                                  NaN
                                                                       NaN
         2 891815181378084864
                                                  NaN
                                                                       NaN
         3 891689557279858688
                                                  NaN
                                                                       NaN
         4 891327558926688256
                                                  NaN
                                                                       NaN
                            timestamp \
         0 2017-08-01 16:23:56 +0000
         1 2017-08-01 00:17:27 +0000
         2 2017-07-31 00:18:03 +0000
         3 2017-07-30 15:58:51 +0000
         4 2017-07-29 16:00:24 +0000
                                                       source \
```

0 <a href="http://twitter.com/download/iphone" r...</pre>

```
1 <a href="http://twitter.com/download/iphone" r...</pre>
2 <a href="http://twitter.com/download/iphone" r...
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
4
                        NaN
                                                    NaN
                                        expanded_urls
                                                              img_num
 https://twitter.com/dog_rates/status/892420643...
1 https://twitter.com/dog_rates/status/892177421...
2 https://twitter.com/dog_rates/status/891815181...
                                                                    1
3 https://twitter.com/dog_rates/status/891689557...
                                                                    1
4 https://twitter.com/dog_rates/status/891327558...
                                                                    2
                 p1_conf p1_dog
                                                  p2
                                                       p2_conf p2_dog
0
        orange 0.097049 False
                                               bagel 0.085851
                                                               False
1
     Chihuahua 0.323581
                           True
                                            Pekinese
                                                     0.090647
                                                                 True
     Chihuahua 0.716012
                           True
                                            malamute 0.078253
                                                                 True
               0.170278 False Labrador_retriever 0.168086
3
                                                                 True
  paper_towel
        basset 0.555712
                           True
                                   English_springer 0.225770
                                                                 True
                            рЗ
                                 p3_conf p3_dog
0
                        banana 0.076110 False
1
                      papillon
                                0.068957
                                            True
2
                        kelpie
                                0.031379
                                            True
3
                       spatula
                               0.040836
                                          False
  German_short-haired_pointer
                                            True
                                0.175219
[5 rows x 30 columns]
```

2.0.4 Define

- Convert tweet_id column to object type as, we are not going to perform mathematical operations over them, those are labels or identifiers.
- Convert 'timestamp' and 'retweeted_status_timestamp' to datetime.
- Convert the columns doggo, floofer, pupper and puppo to bool type.

- Convert 'favorite_count' and 'retweet_count' to numeric type.
- Give descriptive column names to p1, p2, p3, p1_conf, p2_conf, p3_conf, p1_dog, p2_dog, p3_dog.

2.0.5 Code

tweet_id

in_reply_to_status_id

```
In [26]: # Create another copy of the above cleaned dataset before further cleaning
         df_clean_1 =df2_clean.copy()
         # Convert tweet_id column to object type as, those are labels or identifiers.
         df2_clean.tweet_id = df2_clean.tweet_id.astype('object')
         # Convert 'timestamp' and 'retweeted_status_timestamp' to datetime
         df2_clean['timestamp'] = pd.to_datetime(df2_clean['timestamp'])
         df2_clean['retweeted_status_timestamp'] = pd.to_datetime(df2_clean['retweeted_status_ti
         # Convert the columns doggo, floofer, pupper and puppo to true/false values
         df2_clean['doggo'] = (df2_clean['doggo'] == 'doggo').astype(bool)
         df2_clean['floofer'] =(df2_clean['floofer'] == 'floofer').astype(bool)
         df2_clean['pupper'] = (df2_clean['pupper'] == 'pupper').astype(bool)
         df2_clean['puppo'] = (df2_clean['puppo'] == 'puppo').astype(bool)
         # Convert 'favorite_count' and 'retweet_count'to numeric type
         df2_clean[['favorite_count','retweet_count']] = df2_clean[['favorite_count','retweet_co
         # Give descriptive column names to p1, p2, p3, p1_conf, p2_conf, p3_conf, p1_dog, p2_do
         df2_clean = df2_clean.rename(columns =
                                     {'p1': 'Possible_breed_1',
                                     'p2': 'Possible_breed_2',
                                     'p3': 'Possible_breed_3',
                                     'p1_conf': 'Breed_1_confidence',
                                     'p2_conf': 'Breed_2_confidence',
                                     'p3_conf': 'Breed_3_confidence',
                                     'p1_dog': 'Breed_1_present',
                                     'p2_dog': 'Breed_2_present',
                                     'p3_dog': 'Breed_3_present'})
2.0.6 Test
In [27]: df2_clean.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2075 entries, 0 to 2074
Data columns (total 30 columns):
```

2075 non-null object

23 non-null float64

```
23 non-null float64
in_reply_to_user_id
timestamp
                               2075 non-null datetime64[ns]
                               2075 non-null object
source
                               2075 non-null object
text
retweeted_status_id
                              81 non-null float64
retweeted_status_user_id
                               81 non-null float64
retweeted_status_timestamp
                              81 non-null datetime64[ns]
expanded_urls
                               2075 non-null object
                               2075 non-null int64
rating_numerator
rating_denominator
                               2075 non-null int64
                               2075 non-null object
name
                               2075 non-null bool
doggo
                               2075 non-null bool
floofer
                               2075 non-null bool
pupper
                               2075 non-null bool
puppo
                              1794 non-null float64
favorite_count
retweet_count
                              1794 non-null float64
                               2075 non-null object
jpg_url
                               2075 non-null int64
img_num
Possible_breed_1
                               2075 non-null object
Breed_1_confidence
                               2075 non-null float64
                               2075 non-null bool
Breed_1_present
Possible_breed_2
                              2075 non-null object
Breed_2_confidence
                               2075 non-null float64
Breed_2_present
                               2075 non-null bool
                               2075 non-null object
Possible_breed_3
Breed_3_confidence
                               2075 non-null float64
Breed_3_present
                               2075 non-null bool
dtypes: bool(7), datetime64[ns](2), float64(9), int64(3), object(9)
memory usage: 403.2+ KB
```

2.0.7 Define

- Convert Possible_breed_1,Possible_breed_2,Possible_breed_3 to category type
- Convert Breed 1 present, Breed 2 present, Breed 3 present to the type bool.
- Remove the retweets so that we have only original tweets.
- Remove records of Possible_breed_1, Possible_breed_2, Possible_breed_3 which are not dogs i.e which have 'False' values in Breed_1_present, Breed_2_present and Breed_3_present.

2.0.8 Code

```
# Convert Breed_1_present, Breed_2_present, Breed_3_present to the type bool
                   df2_clean.Breed_1_present = df2_clean.Breed_1_present.astype('bool')
                   df2_clean.Breed_2_present = df2_clean.Breed_2_present.astype('bool')
                   df2_clean.Breed_3_present = df2_clean.Breed_3_present.astype('bool')
                   # Remove the retweets so that we have only original tweets i.e remove rows for which re
                   df2_clean = df2_clean[df2_clean.retweeted_status_id.isnull()]
In [29]: # Also we can delete the retweet columns as we don't need retweets
                  del df2_clean['retweeted_status_id']
                   del df2_clean['retweeted_status_user_id']
                   del df2_clean['retweeted_status_timestamp']
In [31]: # Create a copy called df-unclean which is the dataset having things which are not dogs
                  df_unclean = df2_clean.copy()
In [32]: # Remove records of Possible_breed_1, Possible_breed_2, Possible_breed_3 which are not
                   df2_clean = df2_clean[df2_clean['Breed_1_present'] | df2_clean['Breed_2_present'] | df2_clean
2.0.9 Test
In [33]: df2_clean.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 1686 entries, 1 to 2074
Data columns (total 27 columns):
tweet_id
                                                    1686 non-null object
                                                    20 non-null float64
in_reply_to_status_id
in_reply_to_user_id
                                                    20 non-null float64
                                                    1686 non-null datetime64[ns]
timestamp
source
                                                    1686 non-null object
text
                                                    1686 non-null object
                                                    1686 non-null object
expanded_urls
                                                    1686 non-null int64
rating_numerator
                                                    1686 non-null int64
rating_denominator
                                                    1686 non-null object
doggo
                                                    1686 non-null bool
                                                    1686 non-null bool
floofer
                                                    1686 non-null bool
pupper
                                                    1686 non-null bool
puppo
                                                    1442 non-null float64
favorite_count
                                                    1442 non-null float64
retweet_count
                                                    1686 non-null object
jpg_url
                                                    1686 non-null int64
img_num
Possible_breed_1
                                                    1686 non-null category
                                                    1686 non-null float64
Breed_1_confidence
Breed_1_present
                                                    1686 non-null bool
Possible_breed_2
                                                    1686 non-null category
                                                    1686 non-null float64
Breed_2_confidence
```

```
Breed_2_present
                         1686 non-null bool
Possible_breed_3
                         1686 non-null category
Breed_3_confidence
                         1686 non-null float64
Breed_3_present
                         1686 non-null bool
dtypes: bool(7), category(3), datetime64[ns](1), float64(7), int64(3), object(6)
memory usage: 267.8+ KB
```

2.0.10 Define

Combine rating_numerator and rating_denominator into a single column Overall_rating.

2.0.11 Code

```
In [34]: df2_clean['Overall_rating'] = (df2_clean.rating_numerator)/(df2_clean.rating_denominator)
In [35]: del df2_clean['rating_numerator']
         del df2_clean['rating_denominator']
2.0.12 Test
In [36]: df2_clean.info()
```

<class 'pandas.core.frame.DataFrame'> Int64Index: 1686 entries, 1 to 2074 Data columns (total 26 columns):

tweet_id 1686 non-null object 20 non-null float64 in_reply_to_status_id in_reply_to_user_id 20 non-null float64

1686 non-null datetime64[ns] timestamp

1686 non-null object source 1686 non-null object text 1686 non-null object expanded_urls 1686 non-null object name1686 non-null bool doggo 1686 non-null bool floofer pupper 1686 non-null bool 1686 non-null bool puppo 1442 non-null float64 favorite_count 1442 non-null float64 retweet_count 1686 non-null object jpg_url 1686 non-null int64 img_num 1686 non-null category Possible_breed_1 Breed_1_confidence 1686 non-null float64 1686 non-null bool Breed_1_present Possible_breed_2 1686 non-null category Breed_2_confidence 1686 non-null float64 Breed_2_present 1686 non-null bool Possible_breed_3 1686 non-null category

```
Breed_3_confidence 1686 non-null float64
Breed_3_present 1686 non-null bool
Overall_rating 1686 non-null float64
dtypes: bool(7), category(3), datetime64[ns](1), float64(8), int64(1), object(6)
memory usage: 254.6+ KB
```

The missing values in 'in_reply_to_status_id', 'in_reply_to_user_id','retweeted_status_id','retweeted_status_'
'retweeted_status_timestamp', 'favorite_count' and 'retweet_count' columns cannot be treated as
we cannot collect and add those missing values.

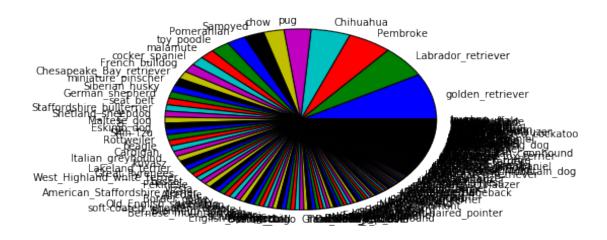
3 Storing, Analyzing and Visualizing Data

The final cleaned dataframe df2_clean can now be stored as CSV file named twitter_archive_master.csv.

```
In [37]: df2_clean.to_csv('twitter_archive_master.csv')
```

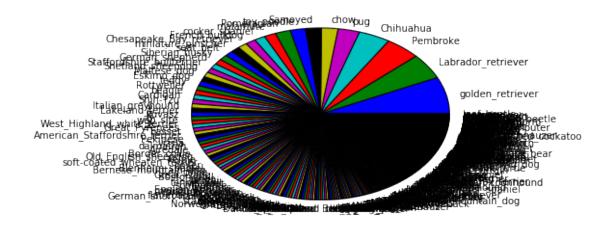
Plot Piechart to find the difference in 'Possible_breed_1' column between clean dataset (having only dog entries) and unclean dataset

Out[38]: <matplotlib.axes._subplots.AxesSubplot at 0x929ae10>

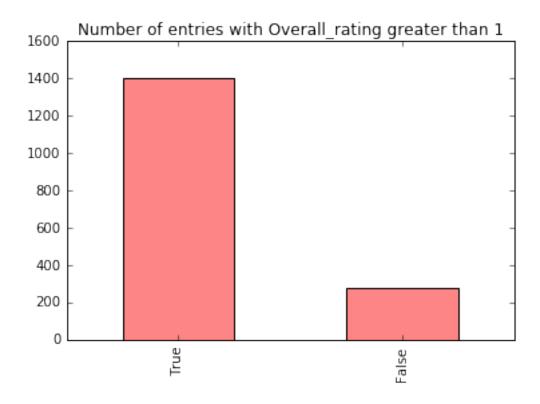


In [39]: # plot all possible dog breeds for df_unclean which has things other than dogs df_unclean.Possible_breed_1.value_counts().plot(kind = 'pie')

Out[39]: <matplotlib.axes._subplots.AxesSubplot at 0xab7cba8>



Analyze 'Overall_rating' column to find number of entries with Overall_rating >=1



3.0.1 Insights

- As seen from the two piecharts plotted above, the clean dataset i.e df2_clean has higher proportion of dog breeds like golden_retriever, Labrador_retriever, Chihuahua, Pembroke etc, but there is comparatively lesser proportion of dogs in df_unclean (the unclean dataset).
- Only 280 entries of dogs have Overall_ratings less than 1 , and the rest 1406 entries have Overall_rating greater than 1.
- The 5 most popular dog breeds from the above dataset are golden_retriever, Labrador_retriever, Pembroke, Chihuahua and pug.