wrangle act

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1 Project Data wrangling "WeRateDogs - 2021"

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2 Introduction

The objective of this project is to verify three basic operations in dealing with data, which are:Gathering data, Assessing data and Cleaning data. This is to reach more accurate data and give realistic results and solutions that can be used. In this project, we discussed obtaining Twitter user @dog_rates, also known as WeRateDogs.

Here in this project, I used the data that Udacity presented in the project file, because of the delay of Twitter in responding to the request for data, the rooms and the goal are the same in both cases

2.1 What is Data Wrangling?

Data wrangling is the process of cleaning, structuring and enriching raw data into a desired format for better decision making in less time. Data wrangling is increasingly ubiquitous at today's top firms. Data has become more diverse and unstructured, demanding increased time spent culling, cleaning, and organizing data ahead of broader analysis. At the same time, with data informing just about every business decision, business users have less time to wait on technical resources for prepared data.

2.2 What is Gathering Data?

Gathering Data is the process of gathering and measuring information on variables of interest, in an established systematic fashion that enables one to answer stated research questions, test hypotheses, and evaluate outcomes.

2.2.1 How to Gathering Data?

We will collect this data

Twitter archive file: download this file manually by clicking the following link: twitter archive enhanced.csv

The tweet image predictions, i.e.This file (image_predictions.tsv) is hosted on Udacity's servers and should be downloaded programmatically using the Requests library and the following URL: $https://d17h27t6h515a5.cloudfront.net/topher/2017/August/599fd2ad_image-predictions/image-predictions.tsv$

Twitter JSON

```
[1]: import pandas as pd
  import numpy as np
  import matplotlib.pyplot as plt
  %matplotlib inline
  import requests
  import json
  import datetime
  import seaborn as sns
  import tweepy
  from PIL import Image
```

2.2.2 1- Twitter archive file

```
[2]: twitter = pd.read_csv('twitter-archive-enhanced-2.csv')
[3]:
    twitter.head()
[3]:
                  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...
     1 <a href="http://twitter.com/download/iphone" r...</pre>
```

```
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
     1
                              NaN
                                                          NaN
     2
                              NaN
                                                          NaN
     3
                              NaN
                                                          NaN
     4
                                                          NaN
                              NaN
                                             expanded_urls rating_numerator
      https://twitter.com/dog_rates/status/892420643...
                                                                          13
     1 https://twitter.com/dog_rates/status/892177421...
                                                                          13
     2 https://twitter.com/dog_rates/status/891815181...
                                                                          12
     3 https://twitter.com/dog_rates/status/891689557...
                                                                          13
     4 https://twitter.com/dog_rates/status/891327558...
                                                                          12
        rating_denominator
                                 name doggo floofer pupper puppo
     0
                         10
                              Phineas
                                       None
                                                None
                                                       None None
                                                None
                                                       None None
     1
                         10
                                Tilly
                                       None
     2
                         10
                               Archie
                                       None
                                                None
                                                       None
                                                             None
     3
                                Darla None
                                                None
                                                       None None
                         10
     4
                         10
                            Franklin None
                                                None
                                                       None None
     twitter.shape
[4]: (2356, 17)
    twitter.info()
[5]:
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 2356 entries, 0 to 2355
    Data columns (total 17 columns):
     #
         Column
                                      Non-Null Count
                                                       Dtype
         _____
     0
         tweet id
                                       2356 non-null
                                                       int64
                                                       float64
     1
         in_reply_to_status_id
                                      78 non-null
         in_reply_to_user_id
                                      78 non-null
                                                       float64
         timestamp
                                      2356 non-null
                                                       object
```

2 <a href="http://twitter.com/download/iphone" r...

```
4
                                 2356 non-null
                                                object
    source
 5
                                 2356 non-null
                                                object
    text
 6
    retweeted_status_id
                                181 non-null
                                                float64
 7
    retweeted_status_user_id
                                181 non-null
                                                float64
 8
    retweeted status timestamp
                                181 non-null
                                                object
    expanded urls
                                 2297 non-null
                                                object
 10
    rating numerator
                                2356 non-null
                                                int64
    rating_denominator
                                2356 non-null
                                                int64
 12 name
                                2356 non-null
                                                object
                                2356 non-null
 13 doggo
                                                object
 14 floofer
                                2356 non-null
                                                object
 15 pupper
                                2356 non-null
                                                object
                                2356 non-null
 16 puppo
                                                object
dtypes: float64(4), int64(3), object(10)
memory usage: 313.0+ KB
```

[6]: twitter.dtypes

```
[6]: tweet_id
                                       int64
     in_reply_to_status_id
                                    float64
     in_reply_to_user_id
                                    float64
     timestamp
                                     object
     source
                                     object
     text
                                     object
     retweeted_status_id
                                    float64
     retweeted status user id
                                    float64
     retweeted_status_timestamp
                                     object
     expanded urls
                                     object
     rating_numerator
                                       int64
     rating_denominator
                                       int64
    name
                                     object
     doggo
                                     object
     floofer
                                     object
                                      object
     pupper
                                      object
     puppo
     dtype: object
```

2.2.3 2- Tweet image prediction

image_predictions.head(30)

```
[7]:
                   tweet_id
                                                                       jpg_url \
     0
         666020888022790149
                             https://pbs.twimg.com/media/CT4udnOWwAAOaMy.jpg
         666029285002620928
                             https://pbs.twimg.com/media/CT42GRgUYAA5iDo.jpg
     1
     2
         666033412701032449
                             https://pbs.twimg.com/media/CT4521TWwAEvMyu.jpg
     3
         666044226329800704
                             https://pbs.twimg.com/media/CT5Dr8HUEAA-1Eu.jpg
     4
                             https://pbs.twimg.com/media/CT5IQmsXIAAKY4A.jpg
         666049248165822465
     5
         666050758794694657
                             https://pbs.twimg.com/media/CT5Jof1WUAEuVxN.jpg
                             https://pbs.twimg.com/media/CT5KoJ1WoAAJash.jpg
     6
         666051853826850816
                             https://pbs.twimg.com/media/CT5N9tpXIAAifs1.jpg
     7
         666055525042405380
     8
         666057090499244032
                             https://pbs.twimg.com/media/CT5PY90WoAAQGLo.jpg
                             https://pbs.twimg.com/media/CT5Qw94XAAA_2dP.jpg
     9
         666058600524156928
     10
         666063827256086533
                             https://pbs.twimg.com/media/CT5Vg wXIAAXfnj.jpg
     11
         666071193221509120
                             https://pbs.twimg.com/media/CT5cN_3WEAA1OoZ.jpg
                             https://pbs.twimg.com/media/CT5d9DZXAAALcwe.jpg
     12
         666073100786774016
     13
         666082916733198337
                             https://pbs.twimg.com/media/CT5m4VGWEAAtKc8.jpg
                             https://pbs.twimg.com/media/CT5w9gUW4AAsBNN.jpg
     14
         666094000022159362
     15
         666099513787052032
                             https://pbs.twimg.com/media/CT51-JJUEAA6hV8.jpg
     16
                             https://pbs.twimg.com/media/CT54YGiWUAEZnoK.jpg
         666102155909144576
                             https://pbs.twimg.com/media/CT56LSZWoAAlJj2.jpg
     17
         666104133288665088
     18
         666268910803644416
                             https://pbs.twimg.com/media/CT8QCd1WEAADXws.jpg
     19
                             https://pbs.twimg.com/media/CT8T1mtUwAA3aqm.jpg
         666273097616637952
     20
         666287406224695296
                             https://pbs.twimg.com/media/CT8g3BpUEAAuFjg.jpg
     21
         666293911632134144
                             https://pbs.twimg.com/media/CT8mx7KW4AEQu8N.jpg
                             https://pbs.twimg.com/media/CT90wFIWEAMuRje.jpg
         666337882303524864
     23
         666345417576210432
                             https://pbs.twimg.com/media/CT9Vn7PWoAA ZCM.jpg
                             https://pbs.twimg.com/media/CT9cxOtUEAAhNN_.jpg
     24
         666353288456101888
                             https://pbs.twimg.com/media/CT9lXGsUcAAyUFt.jpg
     25
         666362758909284353
     26
         666373753744588802
                             https://pbs.twimg.com/media/CT9vZEYWUAA1Z05.jpg
                             https://pbs.twimg.com/media/CT-D2ZHWIAA3gK1.jpg
     27
         666396247373291520
                             https://pbs.twimg.com/media/CT-NvwmW4AAugGZ.jpg
     28
         666407126856765440
                             https://pbs.twimg.com/media/CT-RugiWIAELEaq.jpg
     29
         666411507551481857
                                                 p1_conf
                                                          p1_dog
         img_num
                                            p1
     0
               1
                       Welsh_springer_spaniel
                                                0.465074
                                                            True
     1
               1
                                       redbone
                                                0.506826
                                                            True
     2
               1
                              German_shepherd
                                                0.596461
                                                            True
     3
               1
                          Rhodesian_ridgeback
                                                0.408143
                                                            True
     4
                           miniature pinscher
                                                            True
               1
                                                0.560311
     5
               1
                         Bernese_mountain_dog
                                                0.651137
                                                            True
     6
               1
                                   box turtle
                                                0.933012
                                                           False
     7
               1
                                          chow
                                                0.692517
                                                            True
     8
               1
                                                0.962465
                                                           False
                                shopping_cart
     9
               1
                             miniature_poodle
                                                0.201493
                                                            True
     10
               1
                             golden_retriever
                                                0.775930
                                                            True
```

11	1 Go	rdon_setter	0.503	672 Tr	rue	
12	1 W	Walker_hound			rue	
13	1	pug			rue	
14	1	bloodhound			rue	
15	1	Lhasa			ue	
16	1 Eng	lish_setter	0.298			
17	1	hen				
18		op_computer	0.086 0.176			
19		Italian_greyhound			ue	
20		Maltese_dog			rue	
21		three-toed_sloth			se	
22	1	ox			se	
23		golden_retriever			rue	
24 25	1 1	malamute	0.336			
25 26	1 soft-coated_whea	<pre>guinea_pig ton torrior</pre>	0.996 0.326			
27	1 Solt-coated_whea	Chihuahua				
28	1 black-and-ta					
29	1 Stack and va	coho	0.404			
20	<u>-</u>	COHO	0.101	010 141	.50	
	p2	p2_conf	p2_dog		р3	\
0	collie	0.156665	True		Shetland_sheepdog	
1	miniature_pinscher	0.074192	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-coa	ted_wheaten_terrier	
10	Tibetan_mastiff	0.093718	True		Labrador_retriever	
11	Yorkshire_terrier	0.174201	True		Pekinese	
12	English_foxhound	0.175382	True		Ibizan_hound	
13	bull_mastiff	0.404722	True		French_bulldog	
14 15	German_shepherd Shih-Tzu	0.078260	True		malinois	
15 16	Newfoundland	0.166192 0.149842	True True		Dandie_Dinmont borzoi	
17	wewroundrand cock	0.149042	False		partridge	
18	desk	0.035919	False		bookcase	
19	toy_terrier	0.111884	True		basenji	
20	toy_poodle	0.063064	True		miniature_poodle	
21	otter	0.015250	False		great_grey_owl	
22	Newfoundland	0.278407	True		groenendael	
23	Chesapeake_Bay_retriever	0.054787	True		Labrador_retriever	
24	Siberian_husky	0.147655	True		Eskimo_dog	
25	skunk	0.002402	False		hamster	
-						

```
26
                      Afghan_hound
                                    0.259551
                                                 True
                                                                             briard
     27
                                                 True
                       toy_terrier
                                    0.009397
                                                                           papillon
     28
                        bloodhound
                                    0.244220
                                                 True
                                                              flat-coated_retriever
                        barracouta
     29
                                    0.271485
                                                False
                                                                                 gar
          p3_conf p3_dog
         0.061428
     0
                      True
         0.072010
                     True
     1
     2
         0.116197
                      True
     3
         0.222752
                     True
         0.154629
                      True
     4
     5
         0.016199
                     True
     6
         0.017885
                    False
     7
         0.054449
                    False
     8
         0.007959
                     True
     9
         0.082086
                      True
     10
        0.072427
                     True
         0.109454
                      True
     11
         0.097471
                      True
     12
     13
         0.048960
                     True
     14
         0.075628
                      True
     15
         0.089688
                     True
     16
         0.133649
                     True
     17
         0.000052
                    False
     18
         0.079480
                    False
     19
         0.111152
                     True
         0.025581
     20
                     True
     21
         0.013207
                    False
     22
        0.102643
                     True
     23
        0.014241
                     True
     24
         0.093412
                     True
     25
         0.000461
                    False
         0.206803
                     True
     26
                      True
     27
         0.004577
     28
         0.173810
                      True
     29
         0.189945
                    False
[8]: image_predictions.shape
[8]: (2075, 12)
     image_predictions.info()
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 2075 entries, 0 to 2074
    Data columns (total 12 columns):
         Column
                    Non-Null Count Dtype
```

```
jpg_url
                    2075 non-null
                                     object
      1
      2
          img_num
                    2075 non-null
                                     int64
                    2075 non-null
      3
          р1
                                     object
      4
          p1_conf
                    2075 non-null
                                     float64
          p1_dog
                    2075 non-null
                                     bool
      6
          p2
                    2075 non-null
                                     object
      7
                    2075 non-null
                                    float64
          p2_conf
      8
          p2_dog
                    2075 non-null
                                     bool
                    2075 non-null
      9
          рЗ
                                     object
                    2075 non-null
                                     float64
      10
         p3_conf
      11 p3_dog
                    2075 non-null
                                     bool
     dtypes: bool(3), float64(3), int64(2), object(4)
     memory usage: 152.1+ KB
     2.2.4 3- Twitter JSON
[13]: Json = pd.read_json('tweet-json copy', lines=True)
      Json.head(5)
[13]:
                       created_at
                                                                    id_str \
                                                    id
      0 2017-08-01 16:23:56+00:00 892420643555336193 892420643555336192
      1 2017-08-01 00:17:27+00:00 892177421306343426
                                                       892177421306343424
      2 2017-07-31 00:18:03+00:00 891815181378084864 891815181378084864
      3 2017-07-30 15:58:51+00:00 891689557279858688
                                                       891689557279858688
      4 2017-07-29 16:00:24+00:00 891327558926688256 891327558926688256
                                                  full text truncated \
      O This is Phineas. He's a mystical boy. Only eve...
                                                               False
      1 This is Tilly. She's just checking pup on you...
                                                              False
      2 This is Archie. He is a rare Norwegian Pouncin...
                                                               False
      3 This is Darla. She commenced a snooze mid meal...
                                                               False
      4 This is Franklin. He would like you to stop ca...
                                                               False
        display_text_range
                                                                      entities \
                           {'hashtags': [], 'symbols': [], 'user_mentions...
      0
                   [0, 85]
      1
                  [0, 138]
                            {'hashtags': [], 'symbols': [], 'user_mentions...
                  [0, 121]
                            {'hashtags': [], 'symbols': [], 'user_mentions...
      2
                            {'hashtags': [], 'symbols': [], 'user_mentions...
      3
                   [0, 79]
                  [0, 138]
                            {'hashtags': [{'text': 'BarkWeek', 'indices': ...
                                         extended_entities \
      0 {'media': [{'id': 892420639486877696, 'id_str'...
      1 {'media': [{'id': 892177413194625024, 'id_str'...
```

int64

0

tweet_id 2075 non-null

```
3 {'media': [{'id': 891689552724799489, 'id_str'...
      4 {'media': [{'id': 891327551943041024, 'id_str'...
                                                        source in_reply_to_status_id \
        <a href="http://twitter.com/download/iphone" r...</pre>
                                                                                 NaN
      1 <a href="http://twitter.com/download/iphone" r...</pre>
                                                                                 NaN
      2 <a href="http://twitter.com/download/iphone" r...</pre>
                                                                                 NaN
      3 <a href="http://twitter.com/download/iphone" r...</pre>
                                                                                 NaN
      4 <a href="http://twitter.com/download/iphone" r...
                                                                                 NaN
            favorite_count
                             favorited retweeted possibly_sensitive
      0
                      39467
                                  False
                                              False
      1
                      33819
                                  False
                                              False
                                                                    0.0
      2
                                  False
                                              False
                                                                    0.0
                      25461
      3
                      42908
                                  False
                                              False
                                                                    0.0
      4
                      41048
                                  False
                                              False
                                                                    0.0
        possibly_sensitive_appealable
                                               retweeted_status quoted_status_id \
                                         lang
      0
                                                              NaN
                                                                                NaN
                                    0.0
                                            en
                                    0.0
                                                                                NaN
      1
                                            en
                                                              NaN
      2
                                    0.0
                                                              NaN
                                                                                NaN
                                            en
      3
                                    0.0
                                                                                NaN
                                                              NaN
                                            en
      4
                                    0.0
                                            en
                                                              NaN
                                                                                NaN
         quoted_status_id_str
                                quoted_status
      0
                            NaN
      1
                           NaN
                                            NaN
      2
                           NaN
                                            NaN
      3
                           NaN
                                            NaN
      4
                           NaN
                                            NaN
      [5 rows x 31 columns]
[14]: Json.shape
[14]: (2354, 31)
[15]: Json.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 2354 entries, 0 to 2353
     Data columns (total 31 columns):
           Column
                                            Non-Null Count
                                                             Dtype
                                            2354 non-null
      0
           created_at
                                                             datetime64[ns, UTC]
           id
                                            2354 non-null
                                                             int64
```

2 {'media': [{'id': 891815175371796480, 'id_str'...

```
3
                                         2354 non-null
          full_text
                                                         object
      4
          truncated
                                         2354 non-null
                                                         bool
      5
          display_text_range
                                         2354 non-null
                                                         object
          entities
                                         2354 non-null
                                                         object
      6
      7
          extended entities
                                         2073 non-null
                                                         object
      8
          source
                                         2354 non-null
                                                         object
          in_reply_to_status_id
                                         78 non-null
                                                         float64
      10 in_reply_to_status_id_str
                                         78 non-null
                                                         float64
                                         78 non-null
      11 in_reply_to_user_id
                                                         float64
      12 in_reply_to_user_id_str
                                         78 non-null
                                                         float64
      13 in_reply_to_screen_name
                                         78 non-null
                                                         object
      14 user
                                         2354 non-null
                                                         object
                                         0 non-null
                                                         float64
      15
         geo
      16
         coordinates
                                         0 non-null
                                                         float64
                                         1 non-null
                                                         object
      17 place
      18
         contributors
                                         0 non-null
                                                         float64
      19 is_quote_status
                                         2354 non-null
                                                         bool
      20 retweet_count
                                         2354 non-null
                                                         int64
      21 favorite count
                                         2354 non-null
                                                         int64
                                                         bool
      22 favorited
                                         2354 non-null
      23 retweeted
                                         2354 non-null
                                                         bool
      24 possibly_sensitive
                                         2211 non-null float64
      25 possibly_sensitive_appealable 2211 non-null
                                                        float64
      26 lang
                                         2354 non-null
                                                         object
                                         179 non-null
      27 retweeted_status
                                                         object
                                                         float64
      28 quoted_status_id
                                         29 non-null
      29 quoted_status_id_str
                                                         float64
                                         29 non-null
      30 quoted_status
                                         28 non-null
                                                         object
     dtypes: bool(4), datetime64[ns, UTC](1), float64(11), int64(4), object(11)
     memory usage: 505.9+ KB
[59]: selected attr = []
      with open('tweet-json copy', 'r') as json_file:
         for line in json_file:
              json_data = json.loads(line)
              # create a dictionary with the JSON data, then add to a list tweet_id,_
       → favorites, retweets from the JSON data
              selected_attr.append({'tweet_id': json_data['id'],
                                   'favorites': json_data['favorite_count'],
                                   'retweets': json_data['retweet_count']})
      # convert the tweet JSON data dictionary list to a DataFrame
      Json = pd.DataFrame(selected_attr, columns=['tweet_id', 'favorites', 'retweets'])
[60]: ## Test
      Json.head()
```

2354 non-null

int64

 id_str

2

[60]:		tweet_id	favorites	retweets
	0	892420643555336193	39467	8853
	1	892177421306343426	33819	6514
	2	891815181378084864	25461	4328
	3	891689557279858688	42908	8964
	4	891327558926688256	41048	9774

2.3 Assessing Data and Cleaning data

2.3.1 What is Assessing Data?

Data Quality Assessment is a distinct phase within the data quality life-cycle that is used to verify the source, quantity and impact of any data items that breach pre-defined data quality rules. The Data Quality Assessment is a task typically executed by dedicated Data Quality Software

2.3.2 Quality And Tidiness Issues:

Quality Issues: Delete cells with a lot of missing values

Drop values that contain repeated information

Drop duplicates in jpg url column

Remove html tags in source column

The columns (retweeted_status_id, retweeted_status_user_id, retweeted_status_timestamp) have only 181 values and 2175 missing values (Null values), and retweeted_status_timestamp Column has invalid format.

Create a backup to preserve the original files

The Column timestamp has invalid format, it should be a datetime type.

The Column tweet_id Change from an integer to string .

Tidiness Issues: Combine "'doggo', 'floofer', 'pupper', 'puppo' "columns into a single column called " Dog Stage "

Information about one type of observational unit (tweets) is spread across three different files/dataframes.

Drop columns with missing values: 'in_reply_to_status_id', 'in_reply_to_user_id', 'retweeted_status_id', 'retweeted_status_timestamp', 'expanded_urls'

The file has 2354 rows, the same of tweeter archive file, no issu Merge the columns (p1, p1_dog, p2, p2_dog, p3, p3_dog) in one column called: image prediction, and Merge the columns(p1_conf, p2_conf, p3_conf) in one column called confidence level.

Merge all three dataset and remove repetitive columns. Take both the twitter_clean and Json_clean tables and image_clean merge into one table using the join() method on the columns tweet_id.

2.3.3 What is Cleaning data?

Data cleaning is the process of fixing or removing incorrect, corrupted, incorrectly formatted, duplicate, or incomplete data within a dataset. When combining multiple data sources, there are many opportunities for data to be duplicated or mislabeled

1- Twitter archive file | twitter-archive-enhanced-2.csv

```
[16]:
     twitter
[16]:
                       {\sf tweet\_id}
                                  in_reply_to_status_id
                                                           in_reply_to_user_id
             892420643555336193
      0
                                                      NaN
                                                                             NaN
      1
            892177421306343426
                                                      NaN
                                                                             NaN
      2
             891815181378084864
                                                      NaN
                                                                             NaN
      3
            891689557279858688
                                                      NaN
                                                                             NaN
      4
            891327558926688256
                                                      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
      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...
             <a href="http://twitter.com/download/iphone" r...
      1
      2
             <a href="http://twitter.com/download/iphone" r...</pre>
      3
             <a href="http://twitter.com/download/iphone" r...
             <a href="http://twitter.com/download/iphone" r...</pre>
      4
            <a href="http://twitter.com/download/iphone" r...</pre>
      2351
```

```
2352 <a href="http://twitter.com/download/iphone" r...
2353 <a href="http://twitter.com/download/iphone" r...
2354 <a href="http://twitter.com/download/iphone" r...
2355
     <a href="http://twitter.com/download/iphone" r...</pre>
                                                      text
                                                            retweeted_status_id \
0
      This is Phineas. He's a mystical boy. Only eve...
                                                                           NaN
1
      This is Tilly. She's just checking pup on you...
                                                                          NaN
2
      This is Archie. He is a rare Norwegian Pouncin...
                                                                           NaN
3
      This is Darla. She commenced a snooze mid meal...
                                                                           NaN
4
      This is Franklin. He would like you to stop ca...
                                                                           NaN
2351 Here we have a 1949 1st generation vulpix. Enj...
                                                                           NaN
2352 This is a purebred Piers Morgan. Loves to Netf...
                                                                           NaN
2353 Here is a very happy pup. Big fan of well-main...
                                                                           NaN
2354 This is a western brown Mitsubishi terrier. Up...
                                                                           NaN
2355 Here we have a Japanese Irish Setter. Lost eye...
                                                                           NaN
      retweeted_status_user_id retweeted_status_timestamp
0
                            NaN
                                                         NaN
1
                            NaN
                                                         NaN
2
                            NaN
                                                         NaN
3
                            NaN
                                                         NaN
4
                            NaN
                                                         NaN
2351
                            NaN
                                                         NaN
2352
                            NaN
                                                         NaN
2353
                            NaN
                                                         NaN
2354
                            NaN
                                                         NaN
2355
                            NaN
                                                         NaN
                                            expanded_urls rating_numerator
0
      https://twitter.com/dog_rates/status/892420643...
                                                                         13
1
      https://twitter.com/dog_rates/status/892177421...
                                                                         13
2
      https://twitter.com/dog_rates/status/891815181...
                                                                         12
3
      https://twitter.com/dog_rates/status/891689557...
                                                                         13
4
      https://twitter.com/dog_rates/status/891327558...
                                                                         12
2351 https://twitter.com/dog rates/status/666049248...
                                                                          5
2352 https://twitter.com/dog_rates/status/666044226...
                                                                          6
2353 https://twitter.com/dog rates/status/666033412...
                                                                          9
2354 https://twitter.com/dog_rates/status/666029285...
                                                                          7
2355 https://twitter.com/dog_rates/status/666020888...
      rating_denominator
                               name doggo floofer pupper puppo
0
                       10
                            Phineas
                                      None
                                              None
                                                      None
                                                            None
1
                       10
                              Tilly
                                      None
                                              None
                                                      None
                                                            None
```

2		10	Aı	chie	None	None	None	None
3		10	Ι	Darla	None	None	None	None
4		10	Fran	nklin	None	None	None	None
•••	•••		•••		•••			
2351		10		None	None	None	None	None
2352		10		a	None	None	None	None
2353		10		a	None	None	None	None
2354		10		a	None	None	None	None
2355		10		None	None	None	None	None

[2356 rows x 17 columns]

[17]: twitter.nunique()

[17]: tweet_id 2356 in_reply_to_status_id 77 in_reply_to_user_id 31 2356 timestamp 4 source text 2356 retweeted_status_id 181 retweeted_status_user_id 25 retweeted_status_timestamp 181 expanded_urls 2218 40 rating_numerator rating_denominator 18 957 name doggo 2 2 floofer 2 pupper 2 puppo dtype: int64

[18]: twitter.isnull().sum()

0 [18]: tweet_id in_reply_to_status_id 2278 in_reply_to_user_id 2278 timestamp 0 source 0 text 0 retweeted_status_id 2175 retweeted_status_user_id 2175 retweeted_status_timestamp 2175 expanded_urls 59 rating_numerator 0 rating_denominator 0

```
0
      doggo
      floofer
                                         0
      pupper
                                         0
                                         0
      puppo
      dtype: int64
[23]: twitter.duplicated().sum()
[23]: 0
     sum(twitter['tweet_id'].duplicated())
[19]:
[19]: 0
      twitter.describe()
[26]:
[26]:
                  tweet_id
                            in_reply_to_status_id in_reply_to_user_id
             2.356000e+03
                                      7.800000e+01
                                                            7.800000e+01
      count
      mean
             7.427716e+17
                                      7.455079e+17
                                                            2.014171e+16
      std
             6.856705e+16
                                      7.582492e+16
                                                            1.252797e+17
      min
             6.660209e+17
                                      6.658147e+17
                                                            1.185634e+07
      25%
             6.783989e+17
                                      6.757419e+17
                                                            3.086374e+08
      50%
             7.196279e+17
                                      7.038708e+17
                                                            4.196984e+09
      75%
             7.993373e+17
                                      8.257804e+17
                                                            4.196984e+09
             8.924206e+17
                                      8.862664e+17
                                                            8.405479e+17
      max
             retweeted_status_id
                                   retweeted_status_user_id
                                                               rating_numerator
                     1.810000e+02
                                                1.810000e+02
                                                                    2356.000000
      count
      mean
                     7.720400e+17
                                                1.241698e+16
                                                                       13.126486
      std
                     6.236928e+16
                                                9.599254e+16
                                                                       45.876648
      min
                     6.661041e+17
                                                7.832140e+05
                                                                       0.000000
      25%
                     7.186315e+17
                                                4.196984e+09
                                                                       10.000000
      50%
                     7.804657e+17
                                                4.196984e+09
                                                                       11.000000
      75%
                                                4.196984e+09
                     8.203146e+17
                                                                       12.000000
      max
                     8.874740e+17
                                                7.874618e+17
                                                                    1776.000000
             rating_denominator
                     2356.000000
      count
      mean
                       10.455433
                        6.745237
      std
                        0.000000
      min
      25%
                       10.000000
      50%
                       10.000000
      75%
                       10.000000
      max
                      170.000000
```

0

name

```
[20]: image_predictions.nunique()
[20]: tweet_id
                  2075
      jpg_url
                  2009
      img_num
                     4
      р1
                   378
                  2006
      p1_conf
                      2
      p1_dog
      p2
                   405
                  2004
      p2_conf
      p2_dog
                     2
      р3
                   408
                  2006
      p3_conf
                      2
      p3_dog
      dtype: int64
[21]: image_predictions.isnull().sum()
                  0
[21]: tweet_id
      jpg_url
                  0
                  0
      img_num
      p1
                  0
                  0
      p1_conf
      p1_dog
                  0
                  0
      p2
                  0
      p2_conf
      p2_dog
      рЗ
                  0
                  0
      p3_conf
      p3_dog
                  0
      dtype: int64
[22]: image_predictions.duplicated().sum()
[22]: 0
[24]:
      sum(image_predictions.jpg_url.duplicated())
[24]: 66
      image_predictions.describe()
[25]:
                                img num
                 tweet_id
                                             p1_conf
                                                            p2_conf
                                                                           p3_conf
             2.075000e+03
                            2075.000000
                                         2075.000000
                                                       2.075000e+03
                                                                      2.075000e+03
      count
             7.384514e+17
                               1.203855
                                             0.594548
                                                       1.345886e-01
                                                                      6.032417e-02
      mean
      std
             6.785203e+16
                               0.561875
                                             0.271174
                                                      1.006657e-01 5.090593e-02
```

2-The tweet image predictions, i.e. This file (image_predictions.tsv)

```
6.660209e+17
                              1.000000
                                            0.044333 1.011300e-08 1.740170e-10
     min
      25%
             6.764835e+17
                              1.000000
                                            0.364412 5.388625e-02
                                                                    1.622240e-02
      50%
             7.119988e+17
                              1.000000
                                            0.588230
                                                     1.181810e-01
                                                                    4.944380e-02
                                                                    9.180755e-02
      75%
             7.932034e+17
                              1.000000
                                            0.843855
                                                     1.955655e-01
             8.924206e+17
                              4.000000
                                            1.000000 4.880140e-01 2.734190e-01
     max
[30]: print(image_predictions.p1_dog.value_counts())
      print(image_predictions.p2_dog.value_counts())
      print(image_predictions.p3_dog.value_counts())
     True
              1532
     False
               543
     Name: p1_dog, dtype: int64
     True
              1553
     False
               522
     Name: p2_dog, dtype: int64
     True
              1499
     False
               576
     Name: p3_dog, dtype: int64
     3- Twitter JSON
[62]: Json.isnull().sum()
[62]: tweet_id
                   0
      favorites
                   0
      retweets
                   0
      dtype: int64
 []:
```

2.3.4 Cleaning Data

```
[111]: # Making a copy of all dataframes before data cleaning keep orginals data

twitter_clean = twitter.copy()
image_clean = image_predictions.copy()
Json_clean = Json.copy()
```

Define Change format for timestamp and tweet_id column: The Column tweet_id change from an integer to string and timestamp has invalid format, it should be a datetime type.

Code

```
[94]: | twitter_clean['timestamp'] = pd.to_datetime(twitter_clean['timestamp'])
      twitter_clean['tweet_id'] = twitter_clean['tweet_id'].astype(str)
      image_clean['tweet_id'] = twitter_clean['tweet_id'].astype(str)
      Json_clean['tweet_id'] = Json_clean['tweet_id'].astype(str)
     Test
[95]: twitter_clean.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 2356 entries, 0 to 2355
     Data columns (total 17 columns):
          Column
                                       Non-Null Count
                                                       Dtype
          _____
                                       _____
      0
          tweet_id
                                       2356 non-null
                                                       object
      1
                                                       float64
          in_reply_to_status_id
                                       78 non-null
      2
          in_reply_to_user_id
                                       78 non-null
                                                       float64
                                       2356 non-null
      3
          timestamp
                                                       datetime64[ns, UTC]
      4
          source
                                       2356 non-null
                                                       object
      5
          text
                                       2356 non-null
                                                       object
      6
          retweeted_status_id
                                       181 non-null
                                                       float64
      7
                                                       float64
          retweeted_status_user_id
                                       181 non-null
      8
          retweeted_status_timestamp
                                       181 non-null
                                                       object
          expanded_urls
                                       2297 non-null
                                                       object
                                       2356 non-null
          rating_numerator
                                                       int64
          rating_denominator
                                       2356 non-null
                                                       int64
      12
                                       2356 non-null
         name
                                                       object
      13
          doggo
                                       2356 non-null
                                                       object
      14 floofer
                                       2356 non-null
                                                       object
      15
         pupper
                                       2356 non-null
                                                       object
                                       2356 non-null
      16 puppo
                                                       object
     dtypes: datetime64[ns, UTC](1), float64(4), int64(2), object(10)
     memory usage: 313.0+ KB
[96]: image clean.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 2075 entries, 0 to 2074
     Data columns (total 12 columns):
          Column
                    Non-Null Count Dtype
          _____
                    _____
      0
          tweet_id 2075 non-null
                                     object
                    2075 non-null
      1
          jpg_url
                                    object
      2
          img_num
                    2075 non-null
                                     int64
      3
                    2075 non-null
                                     object
          р1
```

float64

bool

4

p1_conf p1_dog 2075 non-null

2075 non-null

```
7
                     2075 non-null
                                      float64
           p2_conf
       8
                     2075 non-null
                                      bool
           p2_dog
       9
                     2075 non-null
                                      object
           рЗ
                     2075 non-null
                                      float64
       10 p3 conf
       11 p3_dog
                     2075 non-null
                                      bool
      dtypes: bool(3), float64(3), int64(1), object(5)
      memory usage: 152.1+ KB
[97]: Json_clean.info()
      <class 'pandas.core.frame.DataFrame'>
      RangeIndex: 2354 entries, 0 to 2353
      Data columns (total 3 columns):
                      Non-Null Count Dtype
           Column
          _____
                      -----
                      2354 non-null
       0
           {\sf tweet\_id}
                                       object
       1
           favorites 2354 non-null
                                       int64
                      2354 non-null
           retweets
                                       int64
      dtypes: int64(2), object(1)
      memory usage: 55.3+ KB
      Define Remove html tags in source column
      Code
[105]: |twitter_clean.source = twitter_clean.source.str.replace(r'<(?:a\b[^>]*>|/a>)',__
       \hookrightarrow 11)
       twitter_clean.source = twitter_clean.source.astype('category')
      <ipython-input-105-ea97778a6e9d>:1: FutureWarning: The default value of regex
      will change from True to False in a future version.
        twitter_clean.source = twitter_clean.source.str.replace(r'<(?:a\b[^>]*>|/a>)',
      '')
      Test
[106]: twitter_clean['source'].head(5)
[106]: 0
            Twitter for iPhone
            Twitter for iPhone
       1
       2
            Twitter for iPhone
       3
            Twitter for iPhone
            Twitter for iPhone
       Name: source, dtype: category
       Categories (4, object): ['TweetDeck', 'Twitter Web Client', 'Twitter for
       iPhone', 'Vine - Make a Scene']
```

2075 non-null

6

p2

object

Define Remove duplicates of tweets in the row

```
Code
[107]: twitter clean.dropna(subset = ["rating numerator"], inplace=True)
[108]: | twitter_clean.dropna(subset = ["retweeted_status_id"], inplace=True)
      Test
[109]: print (twitter_clean)
                       tweet_id
                                 in_reply_to_status_id in_reply_to_user_id
      19
            888202515573088257
                                                    NaN
                                                                         NaN
      32
            886054160059072513
                                                                         NaN
                                                   NaN
      36
            885311592912609280
                                                   NaN
                                                                         NaN
      68
            879130579576475649
                                                   NaN
                                                                         NaN
      73
            878404777348136964
                                                    NaN
                                                                         NaN
      1023 746521445350707200
                                                    NaN
                                                                         NaN
      1043 743835915802583040
                                                   NaN
                                                                         NaN
      1242 711998809858043904
                                                   NaN
                                                                         NaN
      2259
                                                   NaN
                                                                         NaN
            667550904950915073
      2260 667550882905632768
                                                   NaN
                                                                         NaN
                             timestamp
                                                    source
      19
            2017-07-21 01:02:36 +0000
                                        Twitter for iPhone
      32
            2017-07-15 02:45:48 +0000
                                        Twitter for iPhone
      36
            2017-07-13 01:35:06 +0000
                                        Twitter for iPhone
      68
            2017-06-26 00:13:58 +0000
                                        Twitter for iPhone
      73
            2017-06-24 00:09:53 +0000
                                        Twitter for iPhone
      1023 2016-06-25 01:52:36 +0000
                                        Twitter for iPhone
      1043 2016-06-17 16:01:16 +0000
                                        Twitter for iPhone
      1242 2016-03-21 19:31:59 +0000
                                        Twitter for iPhone
      2259 2015-11-20 03:51:52 +0000
                                        Twitter Web Client
      2260
            2015-11-20 03:51:47 +0000
                                        Twitter Web Client
                                                           text retweeted_status_id \
      19
            RT @dog_rates: This is Canela. She attempted s...
                                                                      8.874740e+17
            RT @Athletics: 12/10 #BATP https://t.co/WxwJmv...
      32
                                                                      8.860537e+17
            RT @dog_rates: This is Lilly. She just paralle...
      36
                                                                      8.305833e+17
            RT @dog_rates: This is Emmy. She was adopted t...
      68
                                                                      8.780576e+17
      73
            RT @dog_rates: Meet Shadow. In an attempt to r...
                                                                      8.782815e+17
            RT @dog_rates: This is Shaggy. He knows exactl...
      1023
                                                                      6.678667e+17
            RT @dog_rates: Extremely intelligent dog here...
      1043
                                                                     6.671383e+17
      1242
            RT @twitter: @dog_rates Awesome Tweet! 12/10. ...
                                                                      7.119983e+17
```

```
RT @dogratingrating: Exceptional talent. Origi...
2259
                                                                6.675487e+17
2260
     RT @dogratingrating: Unoriginal idea. Blatant ...
                                                                6.675484e+17
      retweeted_status_user_id retweeted_status_timestamp
                  4.196984e+09
                                 2017-07-19 00:47:34 +0000
19
32
                  1.960740e+07
                                 2017-07-15 02:44:07 +0000
36
                  4.196984e+09 2017-02-12 01:04:29 +0000
68
                  4.196984e+09 2017-06-23 01:10:23 +0000
73
                  4.196984e+09 2017-06-23 16:00:04 +0000
                  4.196984e+09 2015-11-21 00:46:50 +0000
1023
                  4.196984e+09
                                 2015-11-19 00:32:12 +0000
1043
                                 2016-03-21 19:29:52 +0000
1242
                  7.832140e+05
                                 2015-11-20 03:43:06 +0000
2259
                  4.296832e+09
2260
                  4.296832e+09
                                 2015-11-20 03:41:59 +0000
                                           expanded_urls rating_numerator
19
      https://twitter.com/dog_rates/status/887473957...
                                                                       13
32
      https://twitter.com/dog_rates/status/886053434...
                                                                       12
      https://twitter.com/dog rates/status/830583320...
36
                                                                       13
      https://twitter.com/dog_rates/status/878057613...
68
                                                                       14
73
      https://www.gofundme.com/3yd6y1c,https://twitt...
                                                                       13
     https://twitter.com/dog_rates/status/667866724...
                                                                       10
1023
1043
     https://twitter.com/dog_rates/status/667138269...
                                                                       10
     https://twitter.com/twitter/status/71199827977...
1242
                                                                       12
     https://twitter.com/dogratingrating/status/667...
2259
                                                                       12
     https://twitter.com/dogratingrating/status/667...
                                                                        5
2260
      rating_denominator
                             name doggo floofer pupper puppo
19
                          Canela
                                   None
                                           None
                                                   None
                       10
                                                         None
32
                       10
                             None
                                   None
                                           None
                                                  None
                                                         None
36
                       10
                            Lilly
                                   None
                                           None
                                                  None
                                                        None
                                                        None
68
                       10
                             Emmy
                                   None
                                           None
                                                  None
73
                                                  None None
                       10
                          Shadow
                                   None
                                           None
1023
                       10
                          Shaggy
                                   None
                                           None
                                                  None None
1043
                       10
                             None
                                   None
                                           None
                                                  None
                                                        None
                       10
                             None None
                                                  None None
1242
                                           None
                                                  None None
2259
                       10
                             None None
                                           None
2260
                       10
                             None None
                                                  None None
                                           None
```

[181 rows x 17 columns]

Define Drop columns with missing values: 'in_reply_to_status_id','in_reply_to_user_id','retweeted_status_'retweeted_status_user_id','retweeted_status_timestamp','expanded_urls'

```
Code
[82]: ### Delete columns no needed
      twitter_clean = twitter_clean.
       -drop(['in_reply_to_status_id','in_reply_to_user_id','retweeted_status_id',
      'retweeted status user id', 'retweeted status timestamp', 'expanded urls'], 1)
     Test
[35]: list(twitter clean)
[35]: ['tweet_id',
       'timestamp',
       'source',
       'text',
       'rating numerator',
       'rating_denominator',
       'name',
       'doggo',
       'floofer',
       'pupper',
       'puppo']
     Define Combine "'doggo', 'floofer', 'pupper', 'puppo' "columns into a single column called "
     Dog Stage "
     Code
[39]: twitter_clean[['doggo', 'floofer', 'pupper', 'puppo']].describe()
[39]:
             doggo floofer pupper puppo
              2356
                             2356 2356
      count
                      2356
                 2
                         2
                                 2
                                       2
      unique
      top
              None
                      None
                             None None
                      2346
      freq
              2259
                             2099 2326
[40]: twitter_clean['doggo'].replace('None', '', inplace=True)
      twitter_clean['floofer'].replace('None', '', inplace=True)
      twitter_clean['pupper'].replace('None', '', inplace=True)
      twitter_clean['puppo'].replace('None', '', inplace=True)
[41]: | twitter_clean['Dog_Stage'] = twitter_clean['doggo'] + twitter_clean['floofer']__
       →+twitter clean['pupper'] + twitter clean['puppo']
[42]: twitter_clean.loc[twitter_clean.Dog_Stage == '', 'Dog_Stage'] = np.nan
[43]: twitter_clean['Dog_Stage'].value_counts()
```

```
[43]: pupper
                      245
     doggo
                      83
     puppo
                      29
      doggopupper
                       12
     floofer
                       9
      doggopuppo
                        1
      doggofloofer
                        1
      Name: Dog_Stage, dtype: int64
[44]: | twitter_clean.loc[twitter_clean.Dog_Stage == 'doggopupper', 'Dog_Stage'] = ___
      twitter_clean.loc[twitter_clean.Dog_Stage == 'doggofloofer', 'Dog_Stage'] = __ 
      twitter_clean.loc[twitter_clean.Dog_Stage == 'doggopuppo', 'Dog_Stage'] = __
      [45]: twitter_clean['Dog_Stage'].value_counts()
[45]: pupper
                        245
      doggo
                         83
     puppo
                         29
                         12
      doggo, pupper
                          9
      floofer
      doggo, puppo
                          1
      doggo, floofer
                          1
     Name: Dog_Stage, dtype: int64
[46]: twitter_clean['Dog_Stage'].isnull().value_counts()
[46]: True
              1976
      False
                380
      Name: Dog_Stage, dtype: int64
[47]: | twitter_clean = twitter_clean.drop(['pupper', 'doggo', 'puppo', 'floofer'], axis =___
       \hookrightarrow 1)
     Test
[48]: ## Test
      twitter_clean.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 2356 entries, 0 to 2355
     Data columns (total 8 columns):
          Column
                              Non-Null Count Dtype
          ____
```

```
0
    tweet_id
                         2356 non-null
                                          int64
                                          object
 1
    timestamp
                         2356 non-null
 2
                         2356 non-null
                                          object
     source
 3
    text
                         2356 non-null
                                          object
 4
    rating_numerator
                         2356 non-null
                                          int64
 5
    rating_denominator
                         2356 non-null
                                          int64
 6
                         2356 non-null
                                          object
    Dog_Stage
                         380 non-null
                                          object
dtypes: int64(3), object(5)
memory usage: 147.4+ KB
```

2- image predictions, i.e. This file (image_predictions.tsv)

Define Drop duplicates in jpg_url column

```
[50]: sum(image_clean.jpg_url.duplicated())
[50]: 66

Code
[51]: image_clean.drop_duplicates('jpg_url' , inplace = True)

Test
[52]: sum(image_clean.jpg_url.duplicated())
[52]: 0
```

Define Merge the columns (p1, p1_dog, p2, p2_dog, p3, p3_dog) in one column called: image prediction, and merge the columns(p1_conf, p2_conf, p3_conf) in one column called confidence level.

```
Code
```

```
[53]: dog_type = []
  confidence_level = []

def image(image_clean):
    if image_clean['p1_dog'] == True:
        dog_type.append(image_clean['p1'])
        confidence_level.append(image_clean['p1_conf'])
    elif image_clean['p2_dog'] == True:
        dog_type.append(image_clean['p2'])
        confidence_level.append(image_clean['p2_conf'])
    elif image_clean['p3_dog'] == True:
```

```
dog_type.append(image_clean['p3'])
             confidence_level.append(image_clean['p3_conf'])
         else:
             dog_type.append('Error')
             confidence_level.append('Error')
     image_clean.apply(image, axis=1)
     #create new columns
     image_clean['dog_type'] = dog_type
     image clean['confidence level'] = confidence level
[54]: image_clean = image_clean[image_clean['dog_type'] != 'Error']
[55]: | image_clean = image_clean.drop(['p1', 'p1_conf', 'p1_dog', 'p2', 'p2_conf', __
      Test
[56]: ## Test the execution
     image_clean.info()
     <class 'pandas.core.frame.DataFrame'>
     Int64Index: 1691 entries, 0 to 2073
     Data columns (total 5 columns):
      #
         Column
                           Non-Null Count
                                          Dtype
         _____
         tweet_id
                           1691 non-null
                                           int64
      0
      1
         jpg_url
                           1691 non-null
                                          object
                                           int64
      2
         img_num
                           1691 non-null
      3
         dog_type
                           1691 non-null
                                          object
         confidence_level 1691 non-null
                                          object
     dtypes: int64(2), object(3)
     memory usage: 79.3+ KB
 []:
```

2.4 Merge Dataset

Define Merge all three dataset and remove repetitive columns.

Take both the twitter_clean and Json_clean tables and image_clean merge into one table using the join() method on the columns tweet id.

Code

```
[66]: ## Merge file twitter and Json file with ID=Tweet_id
      File_merge = twitter_clean.join(Json_clean.set_index('tweet_id'), on='tweet_id')
[67]: Marge = File_merge.join(image_clean.set_index('tweet_id'), on='tweet_id')
     Test
[68]: Marge.head()
[68]:
                   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...
      1 <a href="http://twitter.com/download/iphone" r...</pre>
      2 <a href="http://twitter.com/download/iphone" r...</pre>
      3 <a href="http://twitter.com/download/iphone" r...</pre>
      4 <a href="http://twitter.com/download/iphone" r...
                                                        text retweeted_status_id \
      O 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 \
      0 https://twitter.com/dog_rates/status/892420643... ...
                                                                   1.0
      1 https://twitter.com/dog_rates/status/892177421... ...
                                                                   1.0
```

```
2 https://twitter.com/dog_rates/status/891815181... ...
                                                                   1.0
       3 https://twitter.com/dog_rates/status/891689557... ...
                                                                   1.0
       4 https://twitter.com/dog_rates/status/891327558... ...
                                                                   2.0
                        p1_conf p1_dog
                                                              p2_conf p2_dog \
                                                        p2
       0
               orange 0.097049 False
                                                      bagel 0.085851 False
       1
            Chihuahua 0.323581
                                                  Pekinese 0.090647
                                  True
                                                                        True
       2
            Chihuahua 0.716012
                                  True
                                                  malamute 0.078253
                                                                        True
         paper towel 0.170278 False Labrador retriever 0.168086
       3
                                                                        True
               basset 0.555712
                                          English_springer 0.225770
                                  True
                                                                        True
                                   рЗ
                                        p3_conf p3_dog
                               banana 0.076110 False
       0
       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]
[121]: ## Merage All Dataset into one file
       Marge.to_csv('twitter_archive_master-2.csv', index=False, encoding = 'utf-8')
[122]: ## Take a copy form the Marge file
       File_copy = Marge.copy()
[123]: File_copy.info()
      <class 'pandas.core.frame.DataFrame'>
      RangeIndex: 2356 entries, 0 to 2355
      Data columns (total 30 columns):
       #
           Column
                                        Non-Null Count
                                                        Dtype
           _____
       0
           tweet id
                                        2356 non-null
                                                        int64
                                                        float64
           in_reply_to_status_id
                                        78 non-null
       2
           in_reply_to_user_id
                                        78 non-null
                                                        float64
       3
                                        2356 non-null
           timestamp
                                                        object
                                        2356 non-null
       4
           source
                                                        object
       5
           text
                                        2356 non-null
                                                        object
       6
                                                        float64
           retweeted_status_id
                                        181 non-null
       7
                                                        float64
           retweeted_status_user_id
                                        181 non-null
       8
           retweeted_status_timestamp
                                        181 non-null
                                                        object
           expanded_urls
                                        2297 non-null
                                                        object
                                        2356 non-null
                                                        int64
           rating_numerator
                                        2356 non-null
       11
           rating_denominator
                                                        int64
```

2356 non-null

object

12 name

```
floofer
                                         2356 non-null
       14
                                                          object
       15
                                         2356 non-null
                                                          object
           pupper
                                         2356 non-null
                                                          object
       16
           puppo
                                         2354 non-null
                                                          float64
       17
           favorites
           retweets
                                         2354 non-null
                                                          float64
       18
       19
           jpg url
                                         2075 non-null
                                                          object
                                         2075 non-null
       20
           img_num
                                                          float64
                                         2075 non-null
       21
           р1
                                                          object
           p1_conf
                                         2075 non-null
                                                          float64
       22
                                         2075 non-null
       23
           p1_dog
                                                          object
       24
                                         2075 non-null
                                                          object
           p2
                                         2075 non-null
       25
           p2_conf
                                                          float64
                                                          object
                                         2075 non-null
       26
           p2_dog
       27
           рЗ
                                         2075 non-null
                                                          object
       28
           p3_conf
                                         2075 non-null
                                                          float64
       29
           p3_dog
                                         2075 non-null
                                                          object
      dtypes: float64(10), int64(3), object(17)
      memory usage: 552.3+ KB
[124]: File_copy.describe()
[124]:
                   tweet_id
                             in_reply_to_status_id
                                                     in_reply_to_user_id
              2.356000e+03
                                       7.800000e+01
                                                             7.800000e+01
       count
       mean
              7.427716e+17
                                       7.455079e+17
                                                             2.014171e+16
       std
              6.856705e+16
                                       7.582492e+16
                                                             1.252797e+17
       min
              6.660209e+17
                                       6.658147e+17
                                                             1.185634e+07
       25%
              6.783989e+17
                                       6.757419e+17
                                                             3.086374e+08
       50%
              7.196279e+17
                                       7.038708e+17
                                                             4.196984e+09
              7.993373e+17
       75%
                                       8.257804e+17
                                                             4.196984e+09
              8.924206e+17
                                       8.862664e+17
                                                             8.405479e+17
       max
              retweeted_status_id
                                   retweeted_status_user_id
                                                                rating_numerator
                      1.810000e+02
                                                 1.810000e+02
                                                                      2356.000000
       count
                      7.720400e+17
                                                 1.241698e+16
                                                                        13.126486
       mean
       std
                      6.236928e+16
                                                 9.599254e+16
                                                                        45.876648
       min
                      6.661041e+17
                                                 7.832140e+05
                                                                         0.00000
       25%
                      7.186315e+17
                                                 4.196984e+09
                                                                        10.000000
       50%
                      7.804657e+17
                                                 4.196984e+09
                                                                        11.000000
       75%
                                                 4.196984e+09
                                                                        12.000000
                      8.203146e+17
                                                 7.874618e+17
       max
                      8.874740e+17
                                                                      1776.000000
              rating_denominator
                                        favorites
                                                        retweets
                                                                       img_num
       count
                      2356.000000
                                      2354.000000
                                                    2354.000000
                                                                  2075.000000
                        10.455433
                                      8080.968564
                                                     3164.797366
                                                                      1.203855
       mean
       std
                         6.745237
                                     11814.771334
                                                    5284.770364
                                                                      0.561875
                         0.000000
                                         0.000000
                                                        0.000000
       min
                                                                      1.000000
```

2356 non-null

object

doggo

13

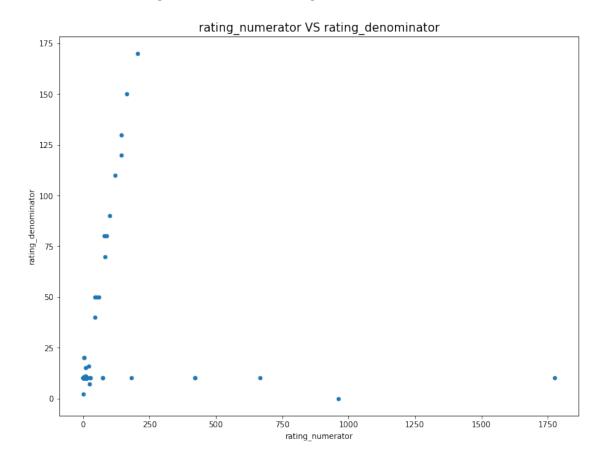
```
25%
                10.000000
                             1415.000000
                                             624.500000
                                                            1.000000
50%
                10.000000
                             3603.500000
                                                            1.000000
                                            1473.500000
75%
                10.000000
                            10122.250000
                                            3652.000000
                                                            1.000000
               170.000000
                           132810.000000
                                          79515.000000
                                                            4.000000
max
           p1_conf
                         p2_conf
                                       p3_conf
       2075.000000
                    2.075000e+03
                                  2.075000e+03
count
mean
          0.594548
                    1.345886e-01
                                  6.032417e-02
          0.271174
                   1.006657e-01 5.090593e-02
std
min
          0.044333
                   1.011300e-08 1.740170e-10
25%
          0.364412 5.388625e-02 1.622240e-02
50%
          0.588230 1.181810e-01 4.944380e-02
75%
          0.843855
                   1.955655e-01 9.180755e-02
max
          1.000000 4.880140e-01 2.734190e-01
```

2.5 Visualizing Data

```
[113]: twitter.plot(x='rating_numerator', y='rating_denominator', kind='scatter').

set_title("rating_numerator VS rating_denominator", size=15)
```

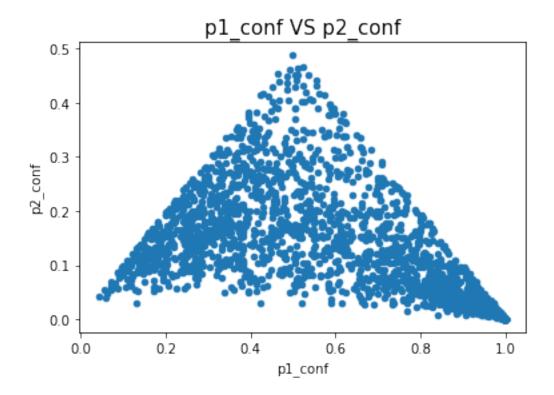
[113]: Text(0.5, 1.0, 'rating_numerator VS rating_denominator')



```
[72]: image_predictions.plot(x='p1_conf', y='p2_conf', kind='scatter').

⇒set_title("p1_conf VS p2_conf", size=15)
```

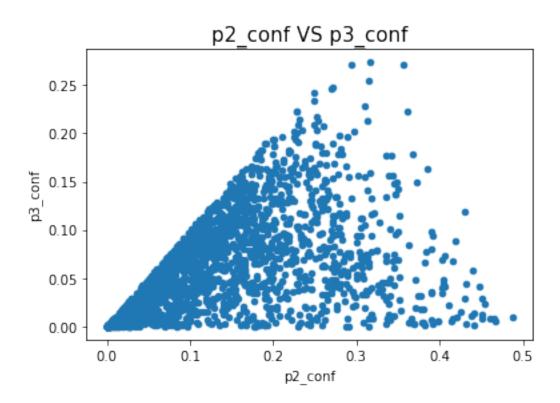
[72]: Text(0.5, 1.0, 'p1_conf VS p2_conf')



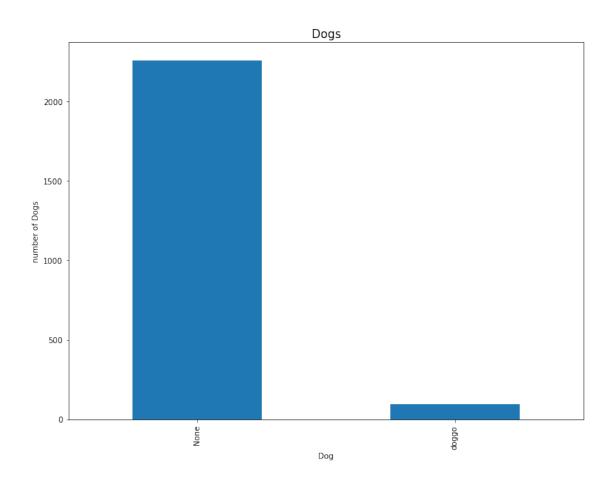
```
[73]: image_predictions.plot(x='p2_conf', y='p3_conf', kind='scatter').

⇒set_title("p2_conf VS p3_conf", size=15)
```

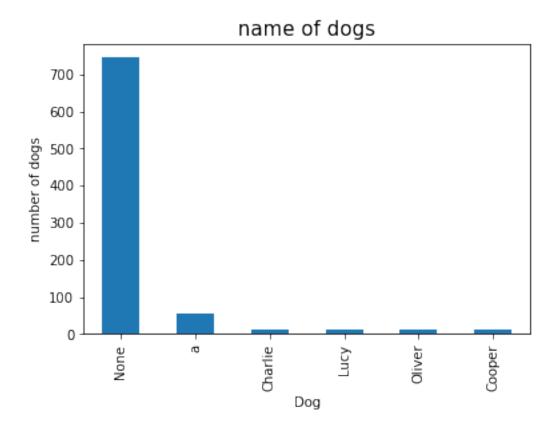
[73]: Text(0.5, 1.0, 'p2_conf VS p3_conf')



[114]: Text(0.5, 1.0, ' Dogs ')



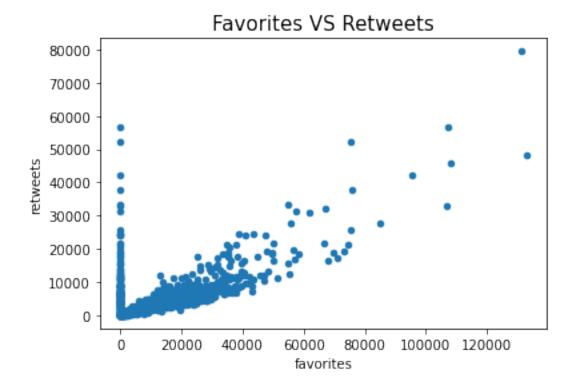
[75]: Text(0.5, 1.0, ' name of dogs ')



```
[90]: File_copy.plot(x='favorites', y='retweets', kind='scatter').

⇔set_title("Favorites VS Retweets", size=15)
```

[90]: Text(0.5, 1.0, 'Favorites VS Retweets')



[]:

2.6 Summary

Download the data to be analyzed The files that must be viewed and made commensurate with each other, because they serve one account, and they are three files that were previously explained, namely (Twitter archive file: download this file manually by clicking the following link: twitter archive enhanced.csv The tweet image predictions, i.e. 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/imagepredictions.tsv Twitter JSON) View the data and know its characteristics through the use of many Python programs in pandas Find and delete duplicate data Query for data that does not contain value Delete data that does not contain a value Describe data that contains individual values and make use of them Know the quality of the image data used in the image data Delete the columns that do not lead to a cognitive value in analyzing the data or that are not useful in the analysis. Rather, it is considered an obstacle in the analysis. If there are many columns, we must focus on the columns that lead to a result in their values and be used.

[]: