## ufo-cleaning

## October 28, 2018

Ideas from Kaggle site: - What areas of the country are most likely to have UFO sightings? - Are there any trends in UFO sightings over time? Do they tend to be clustered or seasonal? - Do clusters of UFO sightings correlate with landmarks, such as airports or government research centers? - What are the most common UFO descriptions?

Potential ideas: - Add weather, population... about the sight? - Military base, airport near the sight?

```
In [28]: %matplotlib inline

import warnings

import pandas as pd

import numpy as np

import seaborn as sns
```

## 0.0.1 Reading data

```
In [127]: # There are some rows with an extra comma that gave reading error
          # Skipped them ~ 300 rows (almost all are nulls)
          # somehow duration seconds has mixed type float and string
          # -> fixed by using low_memory=False
          df = pd.read_csv("../data/complete.csv", error_bad_lines=False, warn_bad_lines=False
          df.head()
Out [127]:
                     datetime
                                                city state country
                                                                        shape \
          0 10/10/1949 20:30
                                                                     cylinder
                                          san marcos
                                                        tx
                                        lackland afb
          1 10/10/1949 21:00
                                                                {\tt NaN}
                                                                        light
          2 10/10/1955 17:00 chester (uk/england)
                                                                       circle
                                                        NaN
                                                                 gb
          3 10/10/1956 21:00
                                                edna
                                                        tx
                                                                 us
                                                                       circle
          4 10/10/1960 20:00
                                             kaneohe
                                                        hi
                                                                        light
                                                                 us
            duration (seconds) duration (hours/min)
                           2700
                                          45 minutes
          0
          1
                           7200
                                             1-2 hrs
          2
                                          20 seconds
                             20
          3
                             20
                                            1/2 hour
                            900
                                          15 minutes
```

comments date posted latitude \

```
O This event took place in early fall around 194...
                                                                 4/27/2004
                                                                            29.8830556
          1 1949 Lackland AFB&#44 TX. Lights racing acros...
                                                                12/16/2005
                                                                              29.38421
          2 Green/Orange circular disc over Chester&#44 En...
                                                                                  53.2
                                                                 1/21/2008
          3 My older brother and twin sister were leaving ...
                                                                 1/17/2004 28.9783333
          4 AS a Marine 1st Lt. flying an FJ4B fighter/att...
                                                                 1/22/2004 21.4180556
              longitude
          0 -97.941111
          1 -98.581082
             -2.916667
          3 -96.645833
          4 -157.803611
Not useful columns
In [128]: # date posted seem not useful
          df.drop(columns=["date posted"], inplace=True)
          # Save comment to seperate variable for tf-idf
          comments = df.loc[df["comments"].notna(), "comments"]
          shapes = df.loc[df["shape"].notna(), "shape"]
          df.drop(columns=["comments", "shape"], inplace=True)
Casting column types
In [129]: df.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 88679 entries, 0 to 88678
Data columns (total 8 columns):
                        88679 non-null object
                        88679 non-null object
                        81270 non-null object
                        76314 non-null object
duration (seconds)
                        88677 non-null object
duration (hours/min)
                        85660 non-null object
                        88679 non-null object
                        88679 non-null float64
dtypes: float64(1), object(7)
memory usage: 5.4+ MB
In [130]: # 1 column has wrong value in latitude
          df = df[df.latitude != '33q.200088']
          df["latitude"] = df.latitude.astype(float, errors="ignore")
In [131]: # this column is the same as duration (seconds)
```

df.drop(columns=["duration (hours/min)"], inplace=True)

datetime

city

state

country

latitude

longitude

```
# some field have this weird charactor "`"
          df["duration"] = df["duration (seconds)"].str.replace("`", "").astype(np.float32)
          df.loc[df["duration"].isna(), "duration"] = df["duration"].mean()
          df.drop(columns=["duration (seconds)"], inplace=True)
In [132]: df.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 88678 entries, 0 to 88678
Data columns (total 7 columns):
datetime
            88678 non-null object
             88678 non-null object
city
             81269 non-null object
state
country
             76314 non-null object
             88678 non-null float64
latitude
             88678 non-null float64
longitude
             88678 non-null float32
duration
dtypes: float32(1), float64(2), object(4)
memory usage: 5.1+ MB
Fill NAs
In [133]: df[df.country.isna()].shape
Out[133]: (12364, 7)
In [134]: # Infer country from state
          df_filled = df.copy()
          # state to country dictionary
          temp = df[["state", "country"]].dropna().drop_duplicates()
          state_to_country = dict(zip(temp["state"], temp["country"]))
          df_filled['country'] = df_filled['country'].fillna(df["state"].map(state_to_country)
          # missing country from ~12k to ~4k
          print(df_filled.country.isna().sum())
          df_filled[df_filled.country.isna()].head()
4662
Out [134]:
                      datetime
                                                               city state country \
          18 10/10/1973 23:00
                                                       bermuda nas
                                                                      {\tt NaN}
                                                                              NaN
          36 10/10/1982 07:00
                                            gisborne (new zealand)
                                                                      {\tt NaN}
                                                                              NaN
          58 10/10/1993 03:00
                                                 zlatoust (russia) NaN
                                                                              NaN
```

```
69 10/10/1996 20:00 lake macquarie (nsw&#44 australia)
                                                                             NaN
                                                                     NaN
          76 10/10/1998 02:00
                                                     turin (italy)
                                                                     {\tt NaN}
                                                                             NaN
                          longitude
                                     duration
               latitude
          18 32.364167 -64.678611
                                         20.0
          36 -38.662334 178.017649
                                        120.0
          58 55.183333
                        59.650000
                                       1200.0
          69 -33.093373 151.588982
                                        300.0
          76 0.000000
                           0.000000
                                         15.0
In [135]: # Convert datetime column into datetime objects. Time to separate column.
          # Some missing or erroneus dates, so using errors='coerce'
          # infer datetime format=True makes this much quicker
          df_filled['datetime'] = pd.to_datetime(df['datetime'], errors='coerce', infer_datetime']
          # couldn't convert some datetime
          # they're a few so we drop
          print(df_filled.datetime.isna().sum())
          df.loc[df_filled.datetime.isna()].head()
1220
Out[135]:
                       datetime
                                                   city state country
                                                                        latitude \
          166 10/10/2005 24:00
                                               franklin
                                                           in
                                                                   us
                                                                       39.480556
          316 10/11/1994 24:00
                                                           sd
                                                                  NaN 43.431646
                                 hot springs and custer
          417 10/11/2006 24:00
                                                                   us 43.212778
                                                   rome
                                                           ny
          487 10/11/2012 24:00
                                                                   us 33.128333
                                  truth or consequences
                                                           nm
          567 10/1/1972 24:00
                                                                   us 44.397778
                                             sweet home
                longitude duration
          166 -86.055000
                                0.0
          316 -103.474362
                                0.0
          417 -75.456111
                              120.0
          487 -107.252222
                                0.0
          567 -122.735000
                                0.0
In [136]: df_filled = df_filled.dropna(subset=["datetime"])
          df_filled['hour'] = df_filled['datetime'].dt.hour.astype(int)
          df_filled['day'] = df_filled['datetime'].dt.day.astype(int)
          df_filled['month'] = df_filled['datetime'].dt.month.astype(int)
          df_filled['year'] = df_filled['datetime'].dt.year.astype(int)
          df_filled.head()
Out[136]:
                       datetime
                                                 city state country
                                                                      latitude \
          0 1949-10-10 20:30:00
                                           san marcos
                                                                 us 29.883056
                                                         t.x
          1 1949-10-10 21:00:00
                                         lackland afb
                                                                 us 29.384210
                                                         tx
          2 1955-10-10 17:00:00 chester (uk/england)
                                                                 gb 53.200000
```

NaN

```
4 1960-10-10 20:00:00
                                              kaneohe
                                                          hi
                                                                  us 21.418056
              longitude duration hour
                                         day
                                              month
                                                     year
          0 -97.941111
                                     20
                                          10
                           2700.0
                                                  10
                                                      1949
          1 -98.581082
                           7200.0
                                     21
                                          10
                                                  10
                                                      1949
          2
              -2.916667
                             20.0
                                     17
                                          10
                                                  10
                                                     1955
          3 -96.645833
                             20.0
                                     21
                                          10
                                                  10
                                                      1956
          4 -157.803611
                            900.0
                                     20
                                          10
                                                  10
                                                     1960
In [137]: df_filled.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 87458 entries, 0 to 88678
Data columns (total 11 columns):
             87458 non-null datetime64[ns]
datetime
             87458 non-null object
city
state
             80269 non-null object
             82954 non-null object
country
             87458 non-null float64
latitude
             87458 non-null float64
longitude
duration
             87458 non-null float32
hour
             87458 non-null int64
day
             87458 non-null int64
month
             87458 non-null int64
             87458 non-null int64
year
dtypes: datetime64[ns](1), float32(1), float64(2), int64(4), object(3)
memory usage: 7.7+ MB
In [140]: df_filled.to_csv("../data/cleaned.csv", index=False)
          comments.to_csv("../data/comments.csv", index=False)
          shapes.to_csv("../data/shapes.csv", index=False)
```

edna

tx

us 28.978333

3 1956-10-10 21:00:00