crowdfunding-project

June 19, 2025

```
[1]: import pandas as pd
     import numpy as np
     import matplotlib.pyplot as plt
     from math import *
     import calendar
     import datetime
    cleaning creators table
[2]: creator=pd.read_excel('/content/Crowdfunding_Creator.xlsx')
[3]: creator.info()
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 334841 entries, 0 to 334840
    Data columns (total 3 columns):
         Column
                          Non-Null Count
                                            Dtype
        ----
     0
         id
                           334841 non-null
                                            int64
     1
         name
                           334826 non-null
                                            object
         chosen_currency 732 non-null
                                            object
    dtypes: int64(1), object(2)
    memory usage: 7.7+ MB
[4]: creator.head()
[4]:
            id
                                                      name chosen_currency
     0
       48480
                                  Robert Maehre (deleted)
                                                                       NaN
     1 383340
                                          Holly (deleted)
                                                                       NaN
     2 463486
                                            Robert Deusser
                                                                       NaN
     3 582581
                StoryShed Media, Michael Maupin (deleted)
                                                                       NaN
     4 905479
                                 Mason Peterson (deleted)
                                                                       NaN
[5]: creator['active_names']=(creator['name']
                               .mask(creator['name']
                                     .str
                                     .contains('(deleted)',
                                               na=False),
```

```
''))
     creator['deleted_names']=(creator['name']
                                .where(creator['name']
                                       str
                                       .contains('(deleted)',
                                                 na=False),
                                       ''))
     creator['deleted_names']=(creator['deleted_names']
                                .split('(',
                                       expand=True)
                                [0])
     creator.head()
    /tmp/ipython-input-5-612821579.py:4: UserWarning: This pattern is interpreted as
    a regular expression, and has match groups. To actually get the groups, use
    str.extract.
      .contains('(deleted)',
    /tmp/ipython-input-5-612821579.py:11: UserWarning: This pattern is interpreted
    as a regular expression, and has match groups. To actually get the groups, use
    str.extract.
      .contains('(deleted)',
[5]:
                                                      name chosen currency \
            id
        48480
                                   Robert Maehre (deleted)
                                                                        NaN
     1 383340
                                           Holly (deleted)
                                                                        NaN
     2 463486
                                            Robert Deusser
                                                                        NaN
     3 582581
                StoryShed Media, Michael Maupin (deleted)
                                                                        NaN
                                 Mason Peterson (deleted)
     4 905479
                                                                        NaN
                                            deleted names
          active_names
     0
                                           Robert Maehre
     1
                                                   Holly
     2 Robert Deusser
     3
                        StoryShed Media, Michael Maupin
     4
                                          Mason Peterson
[6]: creator.drop(columns='name',
                  inplace=True)
     creator.head()
[6]:
            id chosen_currency
                                  active_names
                                                                     deleted_names
         48480
                           {\tt NaN}
                                                                    Robert Maehre
     1 383340
                           NaN
                                                                            Holly
```

```
2 463486
                             NaN
                                  Robert Deusser
      3 582581
                                                  StoryShed Media, Michael Maupin
                             NaN
      4 905479
                             NaN
                                                                    Mason Peterson
     cleaning category table
 [7]: category=pd.read_excel('/content/crowdfunding_Category.xlsx')
 [8]: category.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 169 entries, 0 to 168
     Data columns (total 4 columns):
          Column
                      Non-Null Count Dtype
          ____
      0
          id
                      169 non-null
                                      int64
      1
                      169 non-null
                                      object
          name
      2
          parent_id 154 non-null
                                      float64
                      169 non-null
          position
                                      int64
     dtypes: float64(1), int64(2), object(1)
     memory usage: 5.4+ KB
 [9]: category.head()
 [9]:
          id
                           parent_id position
                     name
         354
                Taxidermy
                                 26.0
                                             12
      1 347
                                 26.0
                    Glass
                                              5
      2 352
                   Quilts
                                 26.0
                                             10
      3 336
                   Flight
                                 16.0
                                              6
      4 255
              Residencies
                                  6.0
                                              2
     cleaning location table
[10]: |location=pd.read_excel('/content/Crowdfunding_Location.xlsx')
      country=pd.read_excel('/content/COUNTRY CODES.xlsx',
                             header=1)
[11]:
     country.head()
[11]:
        Country_Code Full_Country_Name
      0
                  US
                         United States
      1
                  GB
                        United Kingdom
      2
                  FI
                                Finland
      3
                  ΒE
                                Belgium
                  PL
                                 Poland
[12]: location.info()
```

```
Data columns (total 9 columns):
          Column
                             Non-Null Count
                                              Dtype
          _____
                             _____
      0
                             23252 non-null
                                              int64
      1
          displayable_name
                             23252 non-null
                                              object
      2
          type
                             23252 non-null
                                              object
      3
          name
                             23252 non-null
                                              object
      4
          state
                             23225 non-null
                                              object
      5
                             23252 non-null object
          short_name
      6
          is_root
                             23252 non-null
                                              int64
      7
          country
                             23246 non-null
                                             object
          localized_name
                             10354 non-null
                                              object
     dtypes: int64(2), object(7)
     memory usage: 1.6+ MB
[13]: location.head()
[13]:
              id
                    displayable_name
                                       type
                                                        name state
         2351708
                           Accord, NY
                                       Town
                                                      Accord
                                                                NY
      1 2351910
                    Adams Center, NY
                                       Town
                                               Adams Center
                                                                NY
      2 2352490
                            Akron, NY
                                       Town
                                                       Akron
                                                                NY
      3 2353035 Alexandria Bay, NY
                                       Town Alexandria Bay
                                                                NY
      4 2353076
                           Alfred, NY
                                       Town
                                                      Alfred
                                                                NY
                              is_root country localized_name
                 short_name
      0
                 Accord, NY
                                    0
                                           US
                                                          NaN
           Adams Center, NY
                                    0
                                           US
                                                          NaN
      1
      2
                  Akron, NY
                                    0
                                           US
                                                          NaN
        Alexandria Bay, NY
                                    0
                                           US
                                                          NaN
      3
                 Alfred, NY
                                           US
                                                          {\tt NaN}
[14]: |location.drop(columns=['name',
                              'state',
                              'short_name',
                              'is_root',
                              'localized_name'],
                     inplace=True)
      location
[14]:
                  id
                        displayable_name
                                           type country
             2351708
                               Accord, NY
                                           Town
                                                      US
      1
             2351910
                        Adams Center, NY
                                           Town
                                                      US
      2
             2352490
                                Akron, NY
                                           Town
                                                      US
      3
             2353035
                     Alexandria Bay, NY
                                                      US
                                           Town
      4
             2353076
                               Alfred, NY
                                                      US
                                           Town
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 23252 entries, 0 to 23251

```
23248
             2373505
                           Camarillo, CA
                                           Town
                                                     US
                         Los Angeles, CA
      23249
             2442047
                                           Town
                                                     US
      23250
             2382067
                              Clovis, CA
                                          Town
                                                     US
      23251
             2487889
                           San Diego, CA Town
                                                     US
      [23252 rows x 4 columns]
[15]: location=location.merge(country,
                              how='left',
                              left_on='country',
                              right_on='Country_Code')
      location.head()
[15]:
                                      type country_Code Full_Country_Name
              id
                    displayable_name
         2351708
                          Accord, NY
                                       Town
                                                 US
                                                              US
                                                                     United States
                    Adams Center, NY
      1 2351910
                                       Town
                                                 US
                                                              US
                                                                     United States
      2 2352490
                           Akron, NY
                                                 US
                                                                     United States
                                       Town
                                                              US
      3 2353035 Alexandria Bay, NY
                                       Town
                                                 US
                                                              US
                                                                     United States
      4 2353076
                          Alfred, NY
                                      Town
                                                 US
                                                              US
                                                                     United States
[16]: location.drop(columns=['country',
                              'Country_Code']
                    ,inplace=True)
      location
「16]:
                  id
                        displayable_name type Full_Country_Name
      0
             2351708
                              Accord, NY
                                           Town
                                                    United States
      1
             2351910
                        Adams Center, NY
                                           Town
                                                    United States
      2
             2352490
                               Akron, NY
                                           Town
                                                    United States
      3
             2353035
                      Alexandria Bay, NY
                                           Town
                                                    United States
      4
             2353076
                              Alfred, NY
                                                    United States
                                           Town
      23247
             2488828
                       Santa Barbara, CA
                                           Town
                                                    United States
      23248
             2373505
                           Camarillo, CA
                                          Town
                                                    United States
      23249
             2442047
                         Los Angeles, CA
                                           Town
                                                    United States
      23250
                              Clovis, CA
             2382067
                                          Town
                                                    United States
      23251
             2487889
                           San Diego, CA
                                                    United States
                                          Town
      [23252 rows x 4 columns]
[17]: location['city']=location['displayable_name'].str[:-4]
      location['state'] = location['displayable_name'].str[-2:]
```

US

Town

2488828

23247

Santa Barbara, CA

```
location.head()
[17]:
              id
                    displayable_name
                                      type Full_Country_Name
                                                                         city state
         2351708
                                                United States
                          Accord, NY
                                      Town
                                                                       Accord
                                                                                 NY
      1 2351910
                    Adams Center, NY
                                      Town
                                                United States
                                                                 Adams Center
                                                                                 NY
      2 2352490
                           Akron, NY
                                                United States
                                                                                 NY
                                      Town
                                                                        Akron
      3 2353035 Alexandria Bay, NY
                                      Town
                                                United States
                                                                                 NY
                                                              Alexandria Bay
      4 2353076
                          Alfred, NY
                                                United States
                                                                       Alfred
                                                                                 NY
                                      Town
[18]: location['state']=(location['state']
                          .where(location['state']
                                 .str
                                 .isupper(),
                                 ''))
      location.head()
[18]:
              id
                    displayable_name
                                      type Full_Country_Name
                                                                         city state
        2351708
                          Accord, NY
                                       Town
                                                United States
                                                                       Accord
                                                                                 NY
      1 2351910
                    Adams Center, NY
                                                United States
                                                                 Adams Center
                                       Town
                                                                                 NY
      2 2352490
                           Akron, NY
                                      Town
                                                United States
                                                                        Akron
                                                                                 NY
      3 2353035 Alexandria Bay, NY
                                       Town
                                               United States Alexandria Bay
                                                                                 NY
      4 2353076
                          Alfred, NY
                                      Town
                                               United States
                                                                       Alfred
                                                                                 NY
[19]: location.drop(columns=['displayable_name']
                    ,inplace=True)
      location.head()
[19]:
              id type Full_Country_Name
                                                     city state
         2351708
                  Town
                           United States
                                                   Accord
                                                             NY
      1 2351910
                  Town
                           United States
                                            Adams Center
                                                             NY
      2 2352490 Town
                           United States
                                                    Akron
                                                             NY
      3 2353035 Town
                           United States Alexandria Bay
                                                             NY
      4 2353076 Town
                           United States
                                                   Alfred
                                                             NY
     crowdfunding cleaning
[20]: crowdfunding=pd.read_excel('/content/Crowdfunding_projects_1.xlsx')
[21]: crowdfunding.head()
[21]:
               id
                    state
                                                                         name
                                                     Feature Film: The Wolfes
         24080365
                   failed
      1 27131878 failed
                                                                  BarBQ 4REAL
      2 30525634
                   failed
                                                           Down on the Street
      3 31977817
                   failed
                           Descent into Madness-Stream of Conscious Endur...
                             Help us add more content and deliver it faster!
      4 33517733
                  failed
```

```
creator_id location_id category_id created_at
                                                                       deadline \
        country
      0
             US
                 1439247114
                                2488042.0
                                                   293
                                                        1485972639
                                                                     1488571200
      1
             US
                  680525996
                                2466256.0
                                                    10
                                                        1427846948
                                                                     1430507319
      2
             US
                  222229854
                               2458410.0
                                                   276 1457479696
                                                                     1460073915
      3
             US 1978657574
                               2523194.0
                                                    48 1343252842
                                                                     1346342564
      4
             US
                1016683395
                               2433227.0
                                                    18 1427808214 1428676182
                                  currency_symbol usd_pledged static_usd_rate
         updated at
                        currency
      0 1488571201
                             USD
                                                            0.0
                                                                              1.0
                                                 $
                                                            0.0
      1 1430507320 ...
                             USD
                                                                              1.0
      2 1460073915 ...
                             USD
                                                 $
                                                            0.0
                                                                              1.0
      3 1397791317 ...
                             USD
                                                 $
                                                            0.0
                                                                              1.0
      4 1428676219 ...
                             USD
                                                            0.0
                                                 $
                                                                              1.0
         backers_count spotlight staff_pick
      0
                     0
                               0
      1
                     0
                               0
                                           0
      2
                     0
                               0
                                           0
      3
                     0
                               0
                                           0
                                                      blurb currency_trailing_code \
        My film is about a boy who discovers the truth...
                                                                                 1
      1
                                    #Try our BBQ It's 4REAL
                                                                                   1
      2 Welcome to Down on the Street. A proposed exhi...
                                                                                 1
      3 Endurance writing for 72 hours, watch an autho...
                                                                                 1
      4 We need to upgrade our technology to create a ...
                                                                                 1
         disable_communication
      0
                             0
                             0
      1
      2
                             0
      3
                             0
      [5 rows x 25 columns]
[22]: crowdfunding.info()
```

<class 'pandas.core.frame.DataFrame'> RangeIndex: 365892 entries, 0 to 365891 Data columns (total 25 columns):

#	Column	Non-Null Count	Dtype
0	id	365892 non-null	int64
1	state	365892 non-null	object

```
2
                            365842 non-null object
    name
 3
    country
                            365892 non-null object
 4
    creator_id
                            365892 non-null int64
 5
    location_id
                            364378 non-null float64
 6
                            365892 non-null int64
    category id
 7
    created at
                            365892 non-null int64
 8
    deadline
                            365892 non-null int64
 9
    updated_at
                            365892 non-null int64
 10 state_changed_at
                            365892 non-null int64
                            140313 non-null float64
 11
    successful_at
                            365892 non-null int64
 12
    launched_at
                            365892 non-null float64
 13
    goal
                            365892 non-null float64
 14
    pledged
    currency
                            365892 non-null object
 16 currency_symbol
                            365892 non-null object
 17
    usd_pledged
                            365892 non-null float64
 18
    static_usd_rate
                            365892 non-null float64
 19
    backers_count
                            365892 non-null int64
 20
    spotlight
                            365892 non-null int64
 21
    staff pick
                            365892 non-null int64
 22
    blurb
                            365836 non-null object
 23
    currency_trailing_code 365892 non-null int64
 24 disable_communication
                            365892 non-null int64
dtypes: float64(6), int64(13), object(6)
memory usage: 69.8+ MB
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 365892 entries, 0 to 365891
Data columns (total 27 columns):

	•	*	
#	Column	Non-Null Count	Dtype
0	id	365892 non-null	int64
1	state	365892 non-null	object
2	name	365842 non-null	object
3	country	365892 non-null	object
4	creator_id	365892 non-null	int64
5	location_id	364378 non-null	float64
6	category_id	365892 non-null	int64
7	created_at	365892 non-null	int64
8	deadline	365892 non-null	int64

```
365892 non-null int64
      10
          state_changed_at
      11
          successful_at
                                  140313 non-null float64
      12
          launched_at
                                  365892 non-null int64
                                  365892 non-null float64
      13
          goal
          pledged
                                  365892 non-null float64
      14
          currency
                                  365892 non-null object
      16
          currency_symbol
                                  365892 non-null object
          usd pledged
                                  365892 non-null float64
      17
                                  365892 non-null float64
      18
          static_usd_rate
          backers_count
                                  365892 non-null int64
      19
          spotlight
                                  365892 non-null int64
      20
      21
          staff_pick
                                  365892 non-null int64
      22
          blurb
                                  365836 non-null
                                                   object
      23
          currency_trailing_code
                                  365892 non-null int64
          disable_communication
                                  365892 non-null int64
      25
          Country_Code
                                  365892 non-null
                                                   object
      26 Full_Country_Name
                                  365892 non-null object
     dtypes: float64(6), int64(13), object(8)
     memory usage: 75.4+ MB
[24]: crowdfunding.drop(columns=['country',
                                 'currency',
                                 'currency_symbol',
                                 'blurb',
                                 'currency_trailing_code',
                                 'Country_Code'],
                        inplace=True)
      crowdfunding.head()
[24]:
               id
                    state
                                                                        name
                                                    Feature Film: The Wolfes
      0 24080365
                   failed
                                                                 BarBQ 4REAL
      1 27131878
                   failed
      2 30525634
                  failed
                                                          Down on the Street
                           Descent into Madness-Stream of Conscious Endur...
      3 31977817
                   failed
      4 33517733 failed
                             Help us add more content and deliver it faster!
         creator id location id
                                  category_id
                                               created at
                                                             deadline
                                                                       updated at
        1439247114
                       2488042.0
                                          293
                                               1485972639
                                                                       1488571201
      0
                                                           1488571200
      1
          680525996
                       2466256.0
                                           10
                                               1427846948
                                                           1430507319
                                                                       1430507320
      2
          222229854
                       2458410.0
                                          276
                                               1457479696
                                                           1460073915 1460073915
      3
       1978657574
                       2523194.0
                                           48
                                               1343252842
                                                           1346342564
                                                                       1397791317
       1016683395
                       2433227.0
                                               1427808214 1428676182 1428676219
                                           18
         state_changed_at ... launched_at
                                             goal pledged usd_pledged \
      0
                               1485977434 5000.0
                                                       0.0
                                                                    0.0
               1488571201 ...
```

365892 non-null

int64

updated_at

9

```
2
                                                       0.0
                                                                    0.0
               1460073915
                               1457485515 5000.0
                                                       0.0
      3
               1346342564 ...
                               1343750564 5000.0
                                                                    0.0
      4
                               1427812182 5000.0
                                                       0.0
                                                                    0.0
               1428676219
         static_usd_rate backers_count
                                        spotlight
                                                   staff_pick
      0
                     1.0
                                      0
                     1.0
                                      0
                                                 0
                                                             0
      1
      2
                     1.0
                                      0
                                                 0
                                                             0
      3
                     1.0
                                      0
                                                 0
                                                             0
      4
                     1.0
                                      0
                                                 0
                                                             0
         disable_communication Full_Country_Name
      0
                             0
                                    United States
                             0
                                    United States
      1
      2
                             0
                                    United States
      3
                                    United States
                             0
      4
                             0
                                    United States
      [5 rows x 21 columns]
[25]: dates=['created_at', 'deadline', 'updated_at',
             'state_changed_at', 'successful_at', 'launched_at']
      for x in dates:
        crowdfunding[x]=pd.to datetime(crowdfunding[x],unit='s')
      for x in dates:
        crowdfunding[x]=crowdfunding[x].dt.date
      crowdfunding.head()
[25]:
                                                                        name \
               id
                    state
                                                    Feature Film: The Wolfes
      0 24080365 failed
      1 27131878 failed
                                                                 BarBQ 4REAL
      2 30525634 failed
                                                          Down on the Street
      3 31977817 failed Descent into Madness-Stream of Conscious Endur...
      4 33517733 failed
                             Help us add more content and deliver it faster!
         creator_id location_id
                                  category_id
                                               created_at
                                                             deadline
                                                                       updated_at
      0 1439247114
                       2488042.0
                                          293
                                               2017-02-01
                                                           2017-03-03
                                                                       2017-03-03
                                                                       2015-05-01
      1
         680525996
                       2466256.0
                                           10
                                               2015-04-01
                                                           2015-05-01
          222229854
                       2458410.0
                                          276
                                               2016-03-08
                                                           2016-04-08
                                                                       2016-04-08
      3 1978657574
                       2523194.0
                                           48
                                               2012-07-25 2012-08-30 2014-04-18
      4 1016683395
                       2433227.0
                                           18 2015-03-31 2015-04-10 2015-04-10
        state_changed_at ... launched_at
                                         goal pledged usd_pledged \
```

1427915319 5000.0

1

1430507320 ...

0.0

0.0

```
1
                             2015-04-01
                                          5000.0
                                                      0.0
                                                                    0.0
              2015-05-01
                                                                    0.0
      2
              2016-04-08
                             2016-03-09
                                          5000.0
                                                      0.0
      3
                             2012-07-31
                                                      0.0
                                                                    0.0
              2012-08-30
                                          5000.0
      4
              2015-04-10
                             2015-03-31
                                          5000.0
                                                      0.0
                                                                    0.0
                                                     staff_pick
         static_usd_rate
                          backers_count
                                          spotlight
      0
                     1.0
                                                  0
                                                               0
                     1.0
                                                  0
                                                               0
      1
                                       0
      2
                     1.0
                                       0
                                                  0
                                                               0
      3
                     1.0
                                       0
                                                  0
                                                               0
      4
                     1.0
                                       0
                                                               0
         disable_communication Full_Country_Name
      0
                             0
                                     United States
                             0
      1
                                     United States
      2
                              0
                                     United States
      3
                              0
                                     United States
      4
                                     United States
      [5 rows x 21 columns]
[26]: crowdfunding['adjusted_pledged']=__
       ⇔(crowdfunding['static_usd_rate']*crowdfunding['pledged'])
      crowdfunding.head()
[26]:
                    state
               id
                                                                          name
                                                                               \
      0 24080365
                   failed
                                                     Feature Film: The Wolfes
      1 27131878 failed
                                                                   BarBQ 4REAL
                                                           Down on the Street
      2 30525634
                   failed
      3 31977817
                   failed Descent into Madness-Stream of Conscious Endur...
      4 33517733 failed
                             Help us add more content and deliver it faster!
         creator_id location_id category_id
                                                               deadline updated_at \
                                                created_at
       1439247114
                       2488042.0
                                                2017-02-01
                                                            2017-03-03
                                                                         2017-03-03
      0
                                           293
      1
          680525996
                       2466256.0
                                            10
                                                2015-04-01
                                                            2015-05-01
                                                                         2015-05-01
      2
                                           276
          222229854
                       2458410.0
                                                2016-03-08
                                                            2016-04-08
                                                                         2016-04-08
      3 1978657574
                                            48
                                                2012-07-25
                                                            2012-08-30
                                                                         2014-04-18
                       2523194.0
      4 1016683395
                                                            2015-04-10
                                                                         2015-04-10
                       2433227.0
                                            18
                                                2015-03-31
        state_changed_at
                               goal pledged usd_pledged static_usd_rate
              2017-03-03 ...
      0
                             5000.0
                                         0.0
                                                      0.0
                                                                        1.0
                                         0.0
                                                      0.0
                                                                        1.0
      1
              2015-05-01 ...
                             5000.0
      2
              2016-04-08 ... 5000.0
                                         0.0
                                                      0.0
                                                                        1.0
      3
                                                      0.0
                                                                        1.0
              2012-08-30
                             5000.0
                                         0.0
      4
              2015-04-10 ... 5000.0
                                         0.0
                                                      0.0
                                                                        1.0
```

5000.0

0.0

0

2017-03-03 ... 2017-02-01

0.0

```
0
                      0
                                              0
                                                                      0
                      0
                                              0
                                                                      0
                                 0
      1
      2
                      0
                                 0
                                              0
                                                                      0
      3
                      0
                                 0
                                              0
                                                                      0
      4
                      0
                                 0
                                              0
                                                                      0
         Full_Country_Name adjusted_pledged
      0
             United States
             United States
                                          0.0
      1
      2
             United States
                                          0.0
             United States
                                           0.0
             United States
                                           0.0
      [5 rows x 22 columns]
[27]: crowdfunding.drop(columns=['static_usd_rate',
                                   'pledged'],
                         inplace=True)
      crowdfunding.head()
[27]:
               id
                    state
                                                                           name
                                                      Feature Film: The Wolfes
         24080365
                   failed
      0
         27131878
      1
                   failed
                                                                    BarBQ 4REAL
      2 30525634
                   failed
                                                            Down on the Street
      3 31977817
                            Descent into Madness-Stream of Conscious Endur...
                   failed
      4 33517733 failed
                              Help us add more content and deliver it faster!
         creator_id location_id category_id
                                                created_at
                                                                deadline
                                                                          updated_at
                                           293
      0
        1439247114
                        2488042.0
                                                 2017-02-01
                                                             2017-03-03
                                                                          2017-03-03
      1
          680525996
                        2466256.0
                                             10
                                                 2015-04-01
                                                             2015-05-01
                                                                          2015-05-01
      2
                                            276
          222229854
                        2458410.0
                                                 2016-03-08
                                                             2016-04-08
                                                                          2016-04-08
        1978657574
                        2523194.0
                                             48
                                                 2012-07-25
                                                             2012-08-30
                                                                          2014-04-18
         1016683395
                       2433227.0
                                                 2015-03-31
                                                             2015-04-10
                                                                          2015-04-10
                                             18
        state_changed_at successful_at launched_at
                                                              usd_pledged \
                                                        goal
      0
              2017-03-03
                                    NaT 2017-02-01
                                                      5000.0
                                                                       0.0
      1
              2015-05-01
                                         2015-04-01 5000.0
                                                                       0.0
                                    NaT
      2
              2016-04-08
                                    {\tt NaT}
                                         2016-03-09
                                                      5000.0
                                                                       0.0
      3
              2012-08-30
                                    NaT
                                         2012-07-31
                                                      5000.0
                                                                       0.0
      4
              2015-04-10
                                    NaT
                                         2015-03-31
                                                      5000.0
                                                                       0.0
         backers_count
                         spotlight
                                    staff_pick disable_communication
      0
                                              0
                      0
                                 0
                                                                      0
                      0
                                 0
                                              0
                                                                      0
      1
      2
                                 0
                                              0
                      0
                                                                      0
```

spotlight

backers count

staff_pick

disable_communication

```
4
                     0
                                 0
                                             0
                                                                     0
        Full_Country_Name
                           adjusted_pledged
      0
            United States
                                         0.0
            United States
                                         0.0
      1
                                         0.0
      2
            United States
      3
            United States
                                         0.0
            United States
                                         0.0
     calendar table
[28]: min_date=(crowdfunding[dates]
                 .stack()
                 .min())
      max_date=(crowdfunding[dates]
                 .stack()
                 .max())
      all_dates=(pd.date_range(start=min_date,
                                end=max_date,
                                freq='D'))
      calendar=(pd.DataFrame({'dates':all_dates}))
      calendar
[28]:
                dates
      0
           2009-04-21
      1
           2009-04-22
           2009-04-23
           2009-04-24
      4
           2009-04-25
      3627 2019-03-27
      3628 2019-03-28
      3629 2019-03-29
      3630 2019-03-30
      3631 2019-03-31
      [3632 rows x 1 columns]
[29]: calendar['day']=calendar['dates'].dt.day
      calendar['month']=calendar['dates'].dt.month
      calendar['year']=calendar['dates'].dt.year
      calendar['month name']=calendar['dates'].dt.month_name()
```

3

0

0

0

0

```
calendar['quarter']=calendar['dates'].dt.quarter
calendar['weekday']=calendar['dates'].dt.weekday
calendar['day_name']=calendar['dates'].dt.day_name()
calendar['year_month']=calendar['dates'].dt.strftime('%Y-%b')
calendar['financial_month']=((calendar['month']-4+12)%12+1)
calendar['financial_quarter']=((calendar['financial_month']-1)//3)+1
calendar
```

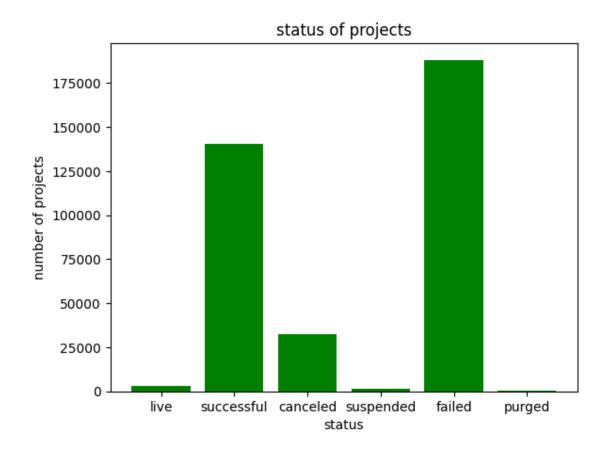
```
[29]:
                        day month year month name quarter
                                                                            day_name \
                 dates
                                                                 weekday
      0
           2009-04-21
                         21
                                     2009
                                                April
                                                                             Tuesday
                                                                        1
                                                              2
      1
           2009-04-22
                         22
                                     2009
                                                April
                                                                        2
                                                                           Wednesday
      2
           2009-04-23
                         23
                                     2009
                                                April
                                                              2
                                                                        3
                                                                            Thursday
      3
           2009-04-24
                         24
                                  4 2009
                                                April
                                                              2
                                                                        4
                                                                              Friday
      4
           2009-04-25
                         25
                                     2009
                                                April
                                                              2
                                                                        5
                                                                            Saturday
      3627 2019-03-27
                                  3 2019
                                                                        2
                         27
                                                March
                                                              1
                                                                           Wednesday
      3628 2019-03-28
                                  3 2019
                                                March
                                                                            Thursday
                         28
                                                              1
                                                                        3
      3629 2019-03-29
                         29
                                  3
                                     2019
                                                March
                                                              1
                                                                        4
                                                                              Friday
                                                                        5
      3630 2019-03-30
                         30
                                  3 2019
                                                March
                                                              1
                                                                            Saturday
      3631 2019-03-31
                         31
                                     2019
                                                March
                                                                        6
                                                                              Sunday
                                                              1
           year_month
                        financial_month
                                          financial_quarter
      0
              2009-Apr
                                                            1
                                       1
              2009-Apr
                                       1
                                                            1
      1
      2
              2009-Apr
                                       1
                                                            1
      3
              2009-Apr
                                       1
                                                            1
              2009-Apr
                                       1
                                                            1
      3627
             2019-Mar
                                      12
                                                            4
      3628
             2019-Mar
                                      12
                                                            4
      3629
             2019-Mar
                                      12
                                                            4
      3630
             2019-Mar
                                      12
                                                            4
                                                            4
      3631
             2019-Mar
                                      12
```

[3632 rows x 11 columns]

exploratory data analysis

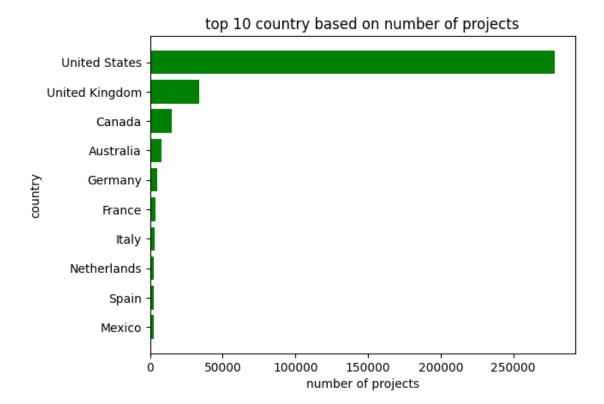
```
state number_of_projects
0
         live
                               3163
1
  successful
                             140313
2
     canceled
                              32498
3
    suspended
                               1501
4
                             188239
       failed
5
                                178
       purged
```

[30]: Text(0, 0.5, 'number of projects')



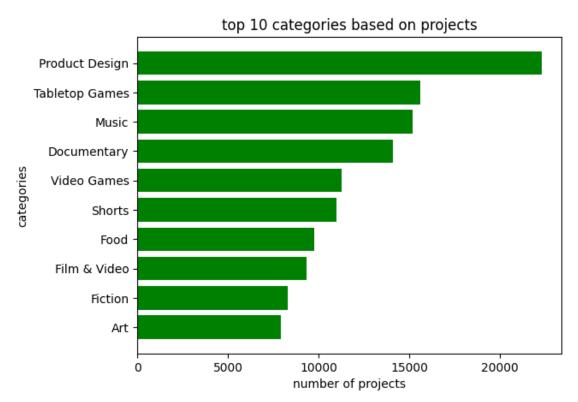
```
[31]: location_number_of_project=(crowdfunding
                                  .groupby('Full_Country_Name')['id']
                                  .count()
                                  .reset_index()
                                  .sort_values('id',
                                               ascending=False)
                                  [:10])
      print(location_number_of_project)
      location_number_of_project_barh=plt.barh(
          location_number_of_project['Full_Country_Name'],
        location_number_of_project['id'],
        color='green')
      plt.title('top 10 country based on number of projects')
      plt.xlabel('number of projects')
      plt.ylabel('country')
      plt.gca().invert_yaxis()
```

	Full_Country_Name	id
21	United States	278524
20	United Kingdom	34074
3	Canada	14774
0	Australia	7757
6	Germany	4714
5	France	3532
9	Italy	3374
13	Netherlands	2836
17	Spain	2737
12	Mexico	2677



```
[32]: category_number_of_project=(crowdfunding
                                   .groupby('category_id')['id']
                                  .count()
                                  .reset_index()
                                   .sort_values('id',
                                                ascending=False)
                                  [:10])
      category_number_of_project=(category_number_of_project
                                  .merge(category,
                                         how='left',
                                         left_on='category_id',
                                         right_on='id'))
      category_number_of_project.rename(columns={'id_x':'number_of_projects'},
                                         inplace=True)
      category_number_of_project[['name','number_of_projects']]
      category_number_of_project_barh=plt.barh(
        category_number_of_project['name'],
        category_number_of_project['number_of_projects'],
        color='green')
      plt.title('top 10 categories based on projects')
```

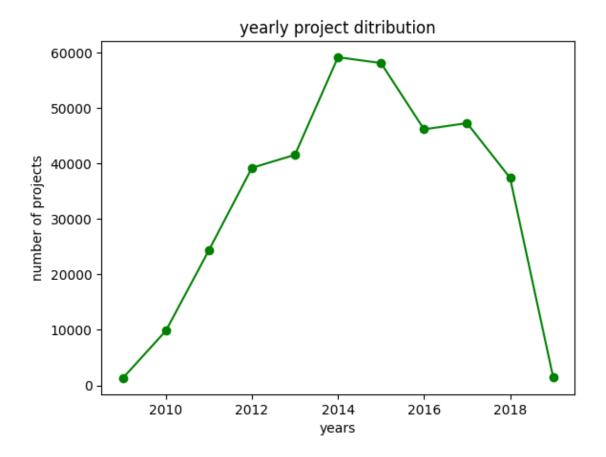
```
plt.xlabel('number of projects')
plt.ylabel('categories')
plt.gca().invert_yaxis()
```



```
[33]: crowdfunding['created_at']=(pd.to_datetime(crowdfunding['created_at']).dt
                                   .normalize())
      calendar['dates'] = pd.to_datetime(calendar['dates']).dt.normalize()
      yearly_number_of_projects=(crowdfunding
                                  .merge(calendar[['dates','year','month','quarter']]
                                         ,how='left'
                                         ,left_on='created_at'
                                         ,right_on='dates'))
      yearly_number_of_projects.rename(columns={'id':'number of projects'}
                                        ,inplace=True)
      yearly_number_of_projects=(yearly_number_of_projects
                                  .groupby('year')
                                  ['number of projects']
                                  .count()
                                  .reset_index()
                                  .sort_values('year',
```

```
number of projects
   year
0
   2009
                        1310
   2010
                        9835
1
2
   2011
                       24359
3
   2012
                       39216
4
   2013
                       41556
5
   2014
                       59155
6
   2015
                       58104
7
   2016
                       46158
8
   2017
                       47270
                       37410
9
   2018
10 2019
                        1519
```

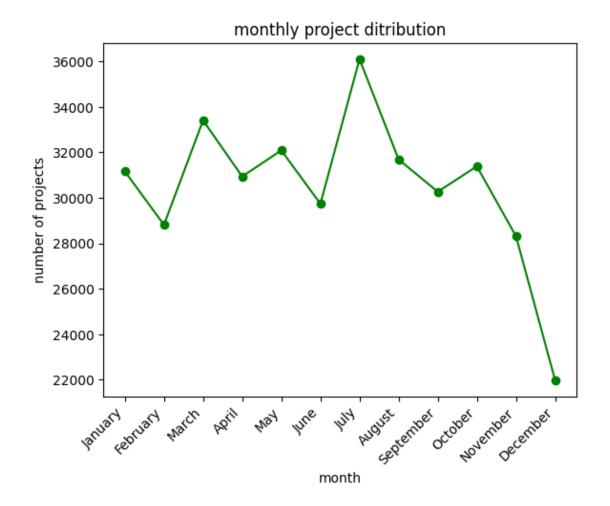
[33]: Text(0, 0.5, 'number of projects')



```
[34]: crowdfunding['created_at']=(pd.to_datetime(crowdfunding['created_at']).dt
                                   .normalize())
      calendar['dates'] = pd.to_datetime(calendar['dates']).dt.normalize()
      monthly_number_of_projects=(crowdfunding
                                   .merge(calendar[['dates','year','month','month_

¬name']]
                                          ,how='left'
                                          ,left_on='created_at'
                                          ,right_on='dates'))
      monthly_number_of_projects.rename(columns={'id':'number of projects'}
                                         ,inplace=True)
      monthly_number_of_projects=(monthly_number_of_projects
                                   .groupby(['month name','month'])
                                   ['number of projects']
                                   .count()
                                   .reset_index()
                                   .sort_values('month',
                                                ascending=True))
      print(monthly_number_of_projects[['month name',
```

```
4
           January
                                   31161
                                   28814
     3
          February
     7
             March
                                   33406
     0
              April
                                   30939
     8
                May
                                   32087
     6
               June
                                   29740
     5
               July
                                   36101
     1
            August
                                  31686
     11 September
                                  30269
           October
     10
                                  31386
     9
          November
                                  28316
     2
          December
                                  21987
[34]: ([0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11],
       [Text(0, 0, 'January'),
        Text(1, 0, 'February'),
        Text(2, 0, 'March'),
        Text(3, 0, 'April'),
        Text(4, 0, 'May'),
        Text(5, 0, 'June'),
        Text(6, 0, 'July'),
        Text(7, 0, 'August'),
        Text(8, 0, 'September'),
        Text(9, 0, 'October'),
        Text(10, 0, 'November'),
        Text(11, 0, 'December')])
```



, errors='coerce')

, errors='coerce')

crowdfunding['successful_at']=pd.to_datetime(crowdfunding['successful_at']

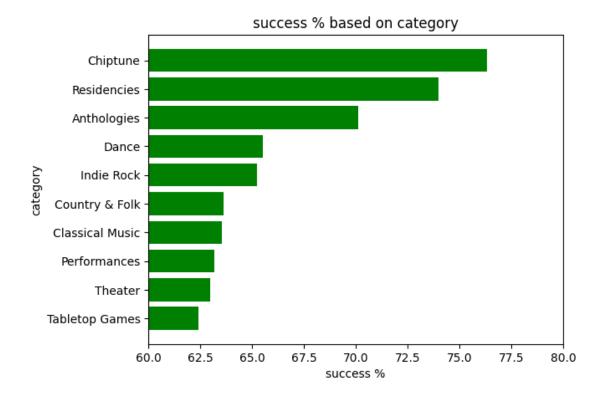
```
successful_project_duration=(crowdfunding[(crowdfunding['state']=='successful')
      &(crowdfunding['launched at'].notna())
      &(crowdfunding['successful_at'].notna())].copy())
      successful_project_duration['duration']=(successful_project_duration['successful_at']-
       ⇔successful_project_duration['launched_at']).dt.days
      successful_project_duration
      average_duration_successful = successful_project_duration['duration'].mean().
      print('average duration of projects are => ',average_duration_successful,'_

days¹)
     average duration of projects are => 31.9
[38]: crowdfunding[['name', 'usd_pledged']].sort_values('usd_pledged',
                                                       ascending=False)[:10]
[38]:
                                                           name
                                                                 usd_pledged
               Pebble Time - Awesome Smartwatch, No Compromises
      257951
                                                                  20338986.27
      252760 COOLEST COOLER: 21st Century Cooler that's Act... 13285226.36
      255265
                         Pebble 2, Time 2 + All-New Pebble Core 12779843.49
      251982
                                     Kingdom Death: Monster 1.5 12393139.69
      236903
                   Pebble: E-Paper Watch for iPhone and Android 10266845.74
              The World's Best TRAVEL JACKET with 15 Feature...
      258314
                                                                9192055.66
     247393
                                              Exploding Kittens
                                                                  8782571.99
      355877
                         OUYA: A New Kind of Video Game Console
                                                                  8596474.58
      246519
             THE 7th CONTINENT - What Goes Up, Must Come Down.
                                                                  7072757.00
      253297
                         The Everyday Backpack, Tote, and Sling
                                                                  6565782.50
[39]: crowdfunding[['name', 'backers_count']].sort_values('backers_count',
                                                         ascending=False)[:10]
[39]:
                                                           name
                                                                backers_count
                                              Exploding Kittens
      247393
                                                                         219382
      252927
                                  Fidget Cube: A Vinyl Desk Toy
                                                                         154926
              Bring Reading Rainbow Back for Every Child, Ev...
      256331
                                                                       105857
      351287
                                The Veronica Mars Movie Project
                                                                          91585
      250606
                                          Double Fine Adventure
                                                                          87142
      254217
                                  Bears vs Babies - A Card Game
                                                                          85581
               Pebble Time - Awesome Smartwatch, No Compromises
      257951
                                                                          78471
      247861
                                     Torment: Tides of Numenera
                                                                          74405
      247034
                                               Project Eternity
                                                                          73986
      241190
                     Yooka-Laylee - A 3D Platformer Rare-vival!
                                                                          73206
[40]: top_10_backers = crowdfunding.nlargest(10,
                                              'backers_count')[['name',
```

```
'backers_count']]
      print(top_10_backers)
                                                            name
                                                                  backers_count
     247393
                                              Exploding Kittens
                                                                         219382
     252927
                                  Fidget Cube: A Vinyl Desk Toy
                                                                         154926
     256331 Bring Reading Rainbow Back for Every Child, Ev...
                                                                       105857
     351287
                                The Veronica Mars Movie Project
                                                                          91585
     250606
                                          Double Fine Adventure
                                                                          87142
     254217
                                  Bears vs Babies - A Card Game
                                                                          85581
     257951
              Pebble Time - Awesome Smartwatch, No Compromises
                                                                          78471
     247861
                                     Torment: Tides of Numenera
                                                                          74405
     247034
                                               Project Eternity
                                                                          73986
     241190
                    Yooka-Laylee - A 3D Platformer Rare-vival!
                                                                          73206
[41]: total projects=crowdfunding['id'].count()
      successfull_project=(crowdfunding[crowdfunding['state']=='successful']['id']
                            .count())
      successfull_percent=((successfull_project*100)/total_projects).round(2)
      print('success % => ',successfull_percent,' %')
     success % => 38.35 %
[53]: category_projects=crowdfunding.merge(category,
                                            how='left',
                                            left_on='category_id',
                                            right_on='id')
      category projects.rename(columns={'name y':'category name',
                                         'id_x':'id'},inplace=True)
      total_category_projects=(category_projects
                                .groupby('category_name')['id']
                                .count()
                                .reset_index())
      total_category_projects
      successfull_category_project=(category_projects
       [category_projects['state'] == 'successful']
                                     .groupby('category_name')['id']
                                     .count()
                                     .reset_index())
      successfull_category_project
      category_success_percent=total_category_projects.
       →merge(successfull category project
```

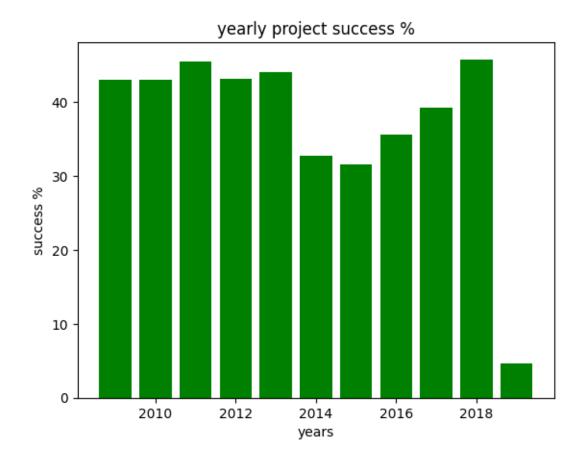
```
,how='left'
                                                        ,on='category_name')
category_success_percent.rename(columns={'id_x':'total',
                                          'id_y':'success'},inplace=True)
category_success_percent['percent']=(category_success_percent['success']*100
                                     /category_success_percent['total']).
 →round(2)
print(category_success_percent.sort_values('percent',
                                           ascending=False)[:10])
top_10_category=category_success_percent.sort_values('percent',
                                                      ascending=False)[:10]
top_10_category_barh=plt.barh(top_10_category['category_name'],
                              top_10_category['percent'],
                              color='green')
plt.title('success % based on category')
plt.xlabel('success %')
plt.ylabel('category')
plt.xlim(60,80)
plt.gca().invert_yaxis()
```

	category_name	total	success	percent
21	Chiptune	38	29	76.32
122	Residencies	73	54	73.97
6	Anthologies	960	673	70.10
36	Dance	2084	1365	65.50
72	Indie Rock	5078	3313	65.24
30	Country & Folk	4246	2701	63.61
23	Classical Music	2454	1559	63.53
99	Performances	1018	643	63.16
141	Theater	6236	3927	62.97
136	Tabletop Games	15618	9749	62.42



```
[63]: yearly_project=crowdfunding.merge(calendar,
                                         how='left',
                                         left_on='launched_at',
                                         right_on='dates')
      yearly_project
      yearly_project_total=(yearly_project
                             .groupby('year')['id']
                             .count()
                             .reset_index()
                             .sort_values('year',
                                          ascending=True))
      yearly_project_total
      yearly_project_success=(yearly_project[yearly_project['state']=='successful']
                               .groupby('year')['id']
                               .count()
                               .reset_index()
                               .sort_values('year',
                                            ascending=True))
      yearly_project_success
      yearly_project_success_percent=(yearly_project_total
```

```
.merge(yearly_project_success
                                              ,how='left'
                                              ,on='year'))
      yearly_project_success_percent.rename(columns={'id_x':'total',
                                                     'id_y':'success'},
                                            inplace=True)
      yearly_project_success_percent['percentage']=(yearly_project_success_percent['success']*100
       →yearly_project_success_percent['total']).round(2)
      print(yearly_project_success_percent)
      yearly_project_success_percent_bar=plt.
       ⇒bar(yearly_project_success_percent['year']
       ,yearly_project_success_percent['percentage']
                                                  ,color='green')
      plt.title('yearly project success %')
      plt.xlabel('years')
     plt.ylabel('success %')
         year total success
                               percentage
     0
         2009
                1172
                          505
                                    43.09
         2010
                9186
                         3955
                                    43.05
     1
                        10465
                                    45.56
     2
         2011 22968
     3
         2012 35884
                        15486
                                    43.16
                                    44.05
     4
         2013 39842
                        17550
     5
                                    32.79
         2014 58814
                        19284
                                    31.54
     6
         2015 59346
                        18717
     7
                                    35.55
         2016 46809
                        16639
     8
         2017 48112
                        18897
                                    39.28
     9
         2018 40772
                        18675
                                    45.80
     10 2019
                          140
                                     4.69
                2987
[63]: Text(0, 0.5, 'success %')
```



```
[67]: monthly_project=crowdfunding.merge(calendar,
                                         how='left',
                                         left_on='launched_at',
                                         right_on='dates')
     monthly_project
     monthly_project_total=(monthly_project
                             .groupby(['month','month name'])['id']
                             .count()
                             .reset_index()
                            .sort_values('month',
                                          ascending=True))
      monthly_project_total
     monthly_project_success=(monthly_project[monthly_project['state']=='successful']
                               .groupby(['month','month name'])['id']
                               .count()
                               .reset_index()
                               .sort_values('month',
                                            ascending=True))
```

```
monthly_project_success
monthly_project_success_percent=(monthly_project_total
                                 .merge(monthly_project_success
                                        ,how='left'
                                        ,on='month'))
monthly_project_success_percent.rename(columns={'id_x':'total',
                                                'id_y':'success',
                                                 'month name x': 'month name'},
                                       inplace=True)
monthly_project_success_percent['percentage'] = (monthly_project_success_percent['success'] *100
 monthly_project_success_percent['total']).round(2)
print(monthly_project_success_percent[['monthu
 →name','total','success','percentage']])
monthly_project_success_percent=plt.bar(monthly_project_success_percent['month']

¬,monthly_project_success_percent['percentage']
                                            ,color='green')
plt.title('yearly project success %')
plt.xlabel('month')
plt.ylabel('success %')
  month name total success percentage
      January 28779
                                    34.74
0
                         9999
    February 27171
                                    41.01
1
                        11142
        March 32142
2
                        13168
                                    40.97
3
        April 30137
                       12404
                                    41.16
4
         May 32307
                       12686
                                    39.27
                     12253
                                    39.25
5
         June 31214
         July 35151
6
                     12193
                                    34.69
7
       August 31758
                     11326
                                    35.66
```

[67]: Text(0, 0.5, 'success %')

September 30630

October 33511

November 31787

December 21305

8

9

10

11

38.89

39.70

39.25

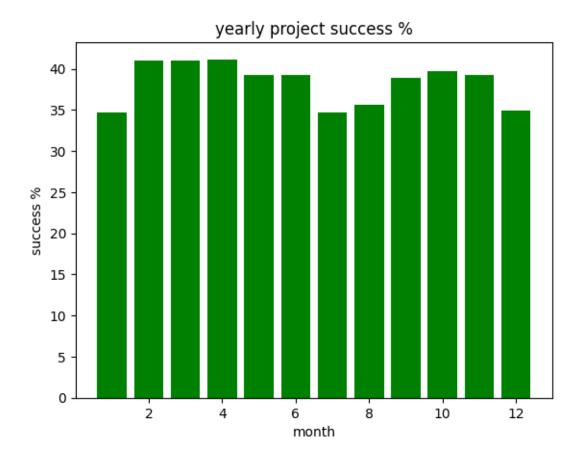
34.97

11912

13303

12477

7450



goal of spotlighted projects => \$ 1723.83 million pledgef on spotlighted projects => \$ 3479.48 million goal acheived => 201.85 %

goal of staff picked projects => \$ 1229.37 million
pledgef on staff picked projects => \$ 1800.11 million
goal acheived => 146.43 %