Part 1: Foundational Data Analysis

Kickstarter, the crowdfunding platform, is thinking about providing a consulting service to project founders to help its customers create more successful crowdfunding campaigns. You've been asked to do some initial analysis.

1. In order to complete this assignment, please follow the link and download the following Kickstarter dataset: http://bit.ly/2cgMGDm. Use the dataset to complete this task.

We are tools agnostics, you can use any tools you'd like: Excel, Python, SQL, Tableau, Google spreadsheets, etc. We recommend using whatever tool you know best, we're here to find out how you think about solving data problems, not which tool you can do it in.

- 2. What is the mean (total) pledge that projects get? (not per backer) Your answer may vary by +/- 5%
- 3. Create a histogram that shows the distribution for number of backers. What is the skew of the distribution?
- 4. Is the 'duration' variable normally distributed?
- 5. If you could collect data on another attribute of these projects, what would it be and why?

1. Preparing data for analysis

1. Loading data.

To prepare the data for analysis, I loaded the dataset into an Oracle12c database, utilizing an external table:

```
create table dsi_kickstarterscrape_ds
     project_id
                               number,
     name
                               nvarchar2(500),
                               varchar2(200),
     url
     category
                               varchar2(100),
     subcategory
                               varchar2(100),
                               nvarchar2(100),
     location
     status
                               varchar2(50),
     goal
                               number,
                               number,
     pledged
                               number,
     funded_percentage
     backers
                               number,
     funded date
                               varchar2(50),
     levels
                               number,
     reward_levels
                               varchar2(1000),
     updates
                               number,
     comments
                               number,
     duration
                               number
)
organization external
  type oracle_loader
  default directory csv_files
  access parameters
  (
      records field names all files
      characterset we8mswin1252
      fields terminated by ','
      optionally enclosed by '"' and '"'
      missing field values are null
  )
  location
    'dsi_kickstarterscrape_dataset.csv'
  )
)
CREATE TABLE dsi_kickstarterscrape_ds i AS
SELECT * FROM dsi_kickstarterscrape_ds;
SELECT COUNT(*) FROM dsi_kickstarterscrape_ds_i;
Count: 45957
```

2. Discovering duplicate rows in the dataset.

When I attempted to create the primary key for this table, Oracle found duplicate rows in the dataset:

```
ALTER TABLE dsi_kickstarterscrape_ds_i
ADD CONSTRAINT pk_project_id
PRIMARY KEY (project_id);

Error report -
SQL Error: ORA-02437: cannot validate (C##DEV.PK_PROJECT_ID) - primary key violated
02437. 00000 - "cannot validate (%s.%s) - primary key violated"
*Cause: attempted to validate a primary key with duplicate values or null values.
*Action: remove the duplicates and null values before enabling a primary key.
```

The following query returned **142 rows** containing PROJECT_ID values of the duplicate rows:

```
SELECT project_id, COUNT(*)
  FROM dsi_kickstarterscrape_ds_i
  GROUP BY project_id
HAVING COUNT(*) > 1;
```

3. Identifying and removing duplicate rows.

I used the following query to identify all duplicate rows in the dataset:

I compared duplicate rows – in the Oracle table and in the original Kickstarter dataset – and found them 100% identical.

19820	506764408 iMAGINARY wORLDS	http://www.kickstarter.com/projects/391021092/imaginary-worlds	Publishing
19821	1727894974 IMAGINATION HEAD NEW ALBUM	http://www.kickstarter.com/projects/294797067/imagination-head-new-album	Music
19822	281344017 Imagination Situation - A Webseries For Parents And Kids	http://www.kickstarter.com/projects/1102654676/imagination-situation-a-web-series-for-parents-and	Film & amp; Video
19823	603454766 Imagine Me	http://www.kickstarter.com/projects/692653576/imagine-me	Games
19824	1051737169 Imagine! Dream! Explore! Wheel of the Year Children's Books	http://www.kickstarter.com/projects/1462174029/imagine-dream-explore-solstice-moon-solstice-sun	Publishing
19825	191126140 Imagine: A reader active comic book co.!	http://www.kickstarter.com/projects/1042659802/imagine-a-reader-active-comic-book-co	Comics
19826	2140333236 Imagined Family Heirlooms: An Archive of Inherited Fictions	http://www.kickstarter.com/projects/andersonstaley/imagined-family-heirlooms-an-archive-of-inherited	Photography
19827	2140333236 Imagined Family Heirlooms: An Archive of Inherited Fictions	http://www.kickstarter.com/projects/andersonstaley/imagined-family-heirlooms-an-archive-of-inherited	Photography
19828	1984248049 Imagining Shakespeare	http://www.kickstarter.com/projects/kevinsprague/imagining-shakespeare	Publishing
19829	648882926 imAnerd Clothing: It's a new NerdStyle Brand	http://www.kickstarter.com/projects/1017911160/a-more-perfect-union	Fashion
19830	2133686007 Imani Uzuri "The Gypsy Diaries" Kickstarter Album Campaign!	http://www.kickstarter.com/projects/1839889570/imani-uzuri-the-gypsy-diaries-kickstarter-album-ca	Music
19831	674235454 Imani Worship - Nashville Bound	http://www.kickstarter.com/projects/1217380520/imani-worship-nashville-bound	Music
19832	1057374918 iMasterCleanse	http://www.kickstarter.com/projects/mikeolaski/imastercleanse	Film & amp; Video
19833	1311084698 IMBC Fashion	http://www.kickstarter.com/projects/jamesd31/imbc-fashion	Design
19834	913297740 IMDB Credit & Dave? Film Course From Diabolical Dave?	http://www.kickstarter.com/projects/syberfilm/imdb-credit-and-film-course-from-diabolical-dave	Film & amp; Video
19835	833441893 iMEE reconceiving the art of dance theatre	http://www.kickstarter.com/projects/1177956491/imee-reconceiving-the-art-of-dance-theatre	Dance

The duplicate rows have been removed from the table:

```
DELETE FROM dsi_kickstarterscrape_ds_i d
WHERE d.ROWID IN

(SELECT a.ROWID AS rid
FROM dsi_kickstarterscrape_ds_i a
MINUS
SELECT MIN(ROWID) AS rid
FROM dsi_kickstarterscrape_ds_i kp
GROUP BY project_id)

142 rows deleted.
```

2. What is the mean (total) pledge that projects get? (not per backer)

Your answer may vary by +/- 5%

Answer: The mean (total) pledge is 4980.75 *

1. Calculating mean for the column PLEDGE:

SELECT ROUND(SUM(pledged)/COUNT(pledged), 2) AS mean
FROM dsi_kickstarterscrape_ds_i;

Mean: 4985.74

or

SELECT ROUND(AVG(pledged), 2) AS mean
FROM dsi_kickstarterscrape_ds_i;

Mean: 4985.74

* For the original dataset (with duplicate rows), both methods produced 4980.75.

3. Create a histogram that shows the distribution for number of backers. What is the skew of the distribution?

Answer: Skewness = 87.34 (which indicates a highly skewed distribution). The curve is positively skewed.

1. Collecting statistical data for the column BACKERS, using procedure **SUMMARY** from the built-in Oracle package **DBMS_STAT_FUNCS**.

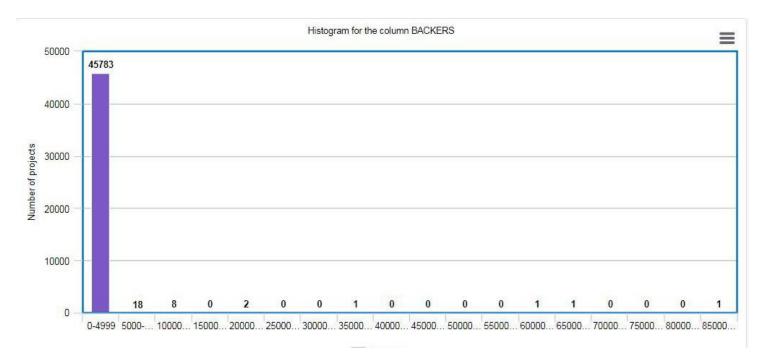
```
DECLARE
   summary_type_out dbms_stat_funcs.SummaryType;
  dbms_stat_funcs.summary('C##DEV', 'DSI_KICKSTARTERSCRAPE_DS_I', 'BACKERS', 3, summary_type_out);
   dbms output.put line('Summary statistics for column BACKERS in the table ' ||
                                                                       'DSI_KICKSTARTERSCRAPE_DS_I');
   dbms_output.put_line('Count: '
                                          || summary_type_out.count);
   dbms output.put line('Min:
                                          || summary type out.min);
   dbms output.put line('Max: '
                                          || summary type out.max);
   dbms_output.put line('Range: '
                                          || summary type out.range);
   dbms_output.put_line('Mean: '
                                          | round(summary type out.mean));
   dbms_output.put_line('Mode Count: '
                                          || summary_type_out.cmode.count);
   dbms_output.put_line('Mode:
                                          || summary_type_out.cmode(1));
   dbms_output.put_line('Variance: '
                                          || round(summary_type_out.variance));
   dbms_output.put_line('Stddev: '
                                          || round(summary_type_out.stddev));
   dbms output.put line('Quantile 25: '
                                             summary type out.quantile 25);
   dbms_output.put_line('Median: '
                                            summary_type_out.median);
   dbms output.put line('Quantile 75: '
                                            summary type out.quantile 75);
   dbms output.put line('Top 5 values: '
                                          || summary_type_out.top_5_values(1) ||
                                             summary_type_out.top_5_values(2) ||
                                             summary_type_out.top_5_values(3) || '-'
                                             summary_type_out.top_5_values(4) ||
                                             summary type out.top 5 values(5));
  dbms_output.put_line('Bottom 5 values: '
                                             || summary type out.bottom 5 values(5) ||
                                                summary type out.bottom 5 values(4) ||
                                                summary type out.bottom 5 values(3) ||
                                                summary_type_out.bottom_5_values(4) || '-'
                                                summary_type_out.bottom_5_values(5));
END;
Summary statistics for column BACKERS in the table DSI KICKSTARTERSCRAPE DS I
Count:
              45815
Min:
              87142
Max:
Range:
              87142
                 70
Mean:
Mode Count:
                  1
Mode:
             475665
Variance:
Stddev:
                690
Quantile 25:
                  5
Median:
                 23
Quantile 75:
                 59
Top 5 values:
                 87142-68929-61290-36276-24883
Bottom 5 values: 0-0-0-0
```

This is a **skewed** distribution where **mean**, **median** and **mode** are markedly different.

2. Generating a histogram for the column BACKERS (bin-width: 5000)

```
SELECT bkt, COUNT(*)
FROM
   (
      SELECT backers,
             CASE
                WHEN backers BETWEEN
                                         0 AND
                                                 4999 THEN '01.
                                                                         4999'
                                                 9999 THEN '02.
                                                                         9999'
                WHEN backers BETWEEN
                                      5000 AND
                                                                 5000
                WHEN backers BETWEEN 10000 AND 14999 THEN '03. 10000 -
                                                                        14999'
                WHEN backers BETWEEN 15000 AND 19999 THEN '04. 15000 - 19999'
                WHEN backers BETWEEN 20000 AND 24999 THEN
                                                           '05. 20000 - 24999'
                WHEN backers BETWEEN 25000 AND 29999 THEN
                                                           '06.
                                                                25000
                WHEN backers BETWEEN 30000 AND 34999 THEN '07.
                                                                30000
                WHEN backers BETWEEN 35000 AND 39999 THEN '08. 35000 - 39999'
                WHEN backers BETWEEN 40000 AND 44999 THEN '09. 40000 - 44999'
                WHEN backers BETWEEN 45000 AND 49999 THEN '10. 45000 - 49999'
                                                           '11. 50000 - 54999'
                WHEN backers BETWEEN 50000 AND 54999
                                                      THEN
                WHEN backers BETWEEN 55000 AND 59999 THEN '12. 55000 - 59999'
                WHEN backers BETWEEN 60000 AND 64999 THEN '13. 60000 - 64999'
                WHEN backers BETWEEN 65000 AND 69999 THEN '14. 65000 - 69999'
                WHEN backers BETWEEN 70000 AND 74999 THEN '15. 70000 - 74999'
                WHEN backers BETWEEN 75000 AND 79999 THEN '16. 75000 - 79999'
                WHEN backers BETWEEN 80000 AND 84999 THEN '17. 80000 - 84999'
                WHEN backers BETWEEN 85000 AND 89999 THEN '18. 85000 - 89999'
            END AS bkt
      FROM dsi kickstarterscrape ds i
GROUP BY bkt
ORDER BY bkt;
```

# of	f backe	ers	<u> </u>	# of projects
01.	0	-	4999	45783
02.	5000	-	9999	18
03.	10000	-	14999	8
05.	20000	-	24999	2
08.	35000	-	39999	1
13.	60000	-	64999	1
14.	65000	-	69999	1
18.	85000	-	89999	1



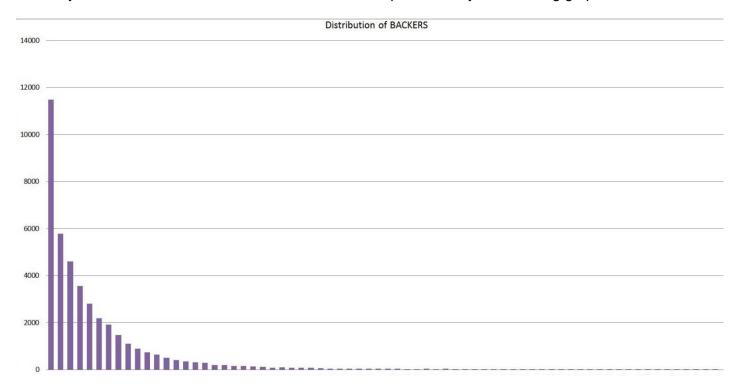
3. Checking outliers.

Checking campaigns with the highest numbers of backers (values that significantly differ from the majority of column values, such as campaign "Double Fine Adventure" with 87,142 backers) shows that in this case, outliers indicate a **heavy-tailed distribution (a** distribution that has **high skewness**) rather than a data error.

This is a **heavily skewed** distribution. It is zero-heavy (3933 campaigns have zero backers) and is concentrated around lower values. There are also a few extremely high values. After the column values reach 700, it is sparsely populated (with values ranging out to over 87,000).

```
SELECT buckets, COUNT(*) as row_count
  FROM (SELECT CASE
                                                                                9'
                   WHEN backers BETWEEN
                                             1 AND
                                                                '001.
                                                                         1 -
                                                       9 THEN
                                            10 AND
                                                                '002.
                                                                        10 -
                                                                               19'
                   WHEN backers BETWEEN
                                                     19 THEN
                                                                        20 -
                                                                                29'
                   WHEN backers BETWEEN
                                            20 AND
                                                                '003.
                                                      29 THEN
                   WHEN backers BETWEEN
                                            30 AND
                                                      39 THEN
                                                                '004.
                                                                        30 -
                                                                                39'
                   WHEN backers BETWEEN
                                                                '005.
                                                                        40
                                                                                49'
                                            40 AND
                                                     49 THEN
                   WHEN backers BETWEEN
                                            50 AND
                                                      59 THEN
                                                                '006.
                                                                        50 -
                                                                                59'
                   WHEN backers BETWEEN
                                            60 AND
                                                     69 THEN
                                                                '007.
                                                                        60 -
                                                                               69'
                   WHEN backers BETWEEN
                                            70 AND
                                                     79 THEN
                                                                '008.
                                                                        70 -
                                                                               79'
                                            80 AND
                                                                               89'
                   WHEN backers BETWEEN
                                                     89 THEN
                                                                '009.
                                                                        80 -
                   WHEN backers BETWEEN
                                                                        90 -
                                                                               99'
                                            90 AND
                                                     99 THEN
                                                                '010.
                                                                       670 -
                                                                              679'
                   WHEN backers BETWEEN
                                           670 AND
                                                    679 THEN
                                                                '068.
                   WHEN backers BETWEEN
                                           680 AND
                                                    689 THEN
                                                                '069.
                                                                       680 -
                                                                              689'
                   WHEN backers BETWEEN
                                                    699 THEN
                                                                '070.
                                                                       690 -
                                         690 AND
                                                                              699'
                END AS buckets
          FROM dsi_kickstarterscrape_ds_i)
 GROUP BY buckets
 ORDER BY buckets;
```

If I select only projects with relatively low number of backers (up to 700) and filter out the projects that do not have any backers, the distribution of BACKERS can be represented by the following graph:



4. Calculating skewness

I used the following method (described in Oracle® Crystal Ball Reference and Examples Guide):

Skewness is computed by finding the third moment about the mean and dividing by the cube of the standard deviation.

Formula:

$$\frac{1}{n} \sum_{i=1}^{n} (x_i - \bar{x})^3$$

$$\frac{1}{s^3}$$

Skewness: 87.34

Another way of calculating skewness:

$$Skew = \frac{n}{(n-1)*(n-2)} * \sum_{i=1}^{n} (\frac{v_i - \mu}{\sigma})^3$$

Skewness: 87.34

This value indicates a **highly skewed** distribution.

4. Is the 'duration' variable normally distributed?

Answer: No, this is not a normal distribution.

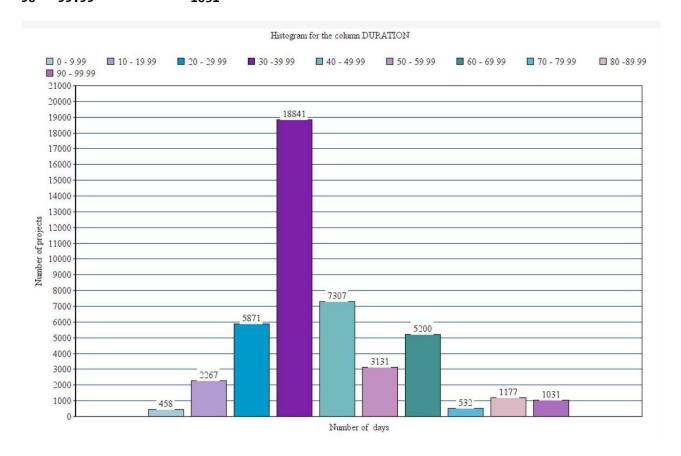
1. Collecting statistical data for the column DURATION, using procedure **SUMMARY** from the Oracle built-in package **DBMS_STAT_FUNCS**.

```
DECLARE
   summary_type_out dbms_stat_funcs.SummaryType;
BEGIN
   dbms_stat_funcs.summary('C##DEV', 'DSI_KICKSTARTERSCRAPE_DS_I', 'DURATION', 3,
                                                                      summary type out);
   dbms output.put line('Summary statistics for column DURATION in the table ' ||
                                                            'DSI KICKSTARTERSCRAPE DS I');
   dbms_output.put_line('Count: '
                                            summary type out.count);
   dbms_output.put_line('Min:
                                         || summary_type_out.min);
   dbms_output.put_line('Max: '
                                         || summary_type_out.max);
   dbms_output.put_line('Range: '
                                         || summary_type_out.range);
   dbms_output.put_line('Mean: '
                                         || round(summary_type_out.mean));
   dbms_output.put_line('Mode Count: '
                                         || summary type out.cmode.count);
   dbms_output.put_line('Mode: '
                                         || summary_type_out.cmode(1));
   dbms_output.put_line('Variance: '
                                         | round(summary_type_out.variance));
   dbms_output.put_line('Stddev: '
                                            round(summary_type_out.stddev));
   dbms_output.put_line('Quantile 25: '
                                            summary_type_out.quantile_25);
   dbms_output.put_line('Median: '
                                         || summary_type_out.median);
   dbms output.put line('Quantile 75: '
                                         || summary_type_out.quantile_75);
   dbms_output.put_line('Top 5 values: '
                                         || summary_type_out.top_5_values(1) ||
                                            summary_type_out.top_5_values(2) ||
                                            summary_type_out.top_5_values(3) || '-'
                                            summary_type_out.top_5_values(4) ||
                                            summary type out.top 5 values(5));
   dbms_output.put_line('Bottom 5 values: '
                                            || summary_type_out.bottom_5_values(5) ||
                                               summary_type_out.bottom_5_values(4) ||
                                               summary_type_out.bottom_5_values(3) || '-'
                                               summary_type_out.bottom_5_values(4) || '-' ||
                                               summary type out.bottom 5 values(5));
END;
Summary statistics for column DURATION in the table DSI_KICKSTARTERSCRAPE_DS_I
Count:
              45815
Min:
                  1
                 91.96
Max:
                 90.96
Range:
Mean:
                 40
Mode Count:
                  1
Mode:
                 30
Variance:
                303
Stddev:
                 17
Quantile 25:
                 30
Median:
                 32
Quantile 75:
                 48.395
Top 5 values:
                 91.96-91.96-91.96-91.96
Bottom 5 values: 1-1-1-1
```

This is a **skewed** distribution where **mean**, **median** and **mode** are different.

2. Generating a histogram for the column DURATION (bin-width: 10)

```
SELECT bkt, count(*)
FROM
   (
    SELECT duration,
           CASE
             WHEN duration > 0 AND duration < 10 THEN '0 - 9.99'
             WHEN duration >= 10 AND duration < 20 THEN '10 - 19.99'
             WHEN duration >= 20 AND duration < 30 THEN '20 - 29.99'
             WHEN duration >= 30 AND duration < 40 THEN '30 - 39.99'
             WHEN duration >= 40 AND duration < 50 THEN '40 - 49.99'
             WHEN duration >= 50 AND duration < 60 THEN '50 - 59.99'
             WHEN duration >= 60 AND duration < 70 THEN '60 - 69.99'
             WHEN duration >= 70 AND duration < 80 THEN '70 - 79.99'
             WHEN duration >= 80 AND duration < 90 THEN '80 - 89.99'
             WHEN duration >= 90 AND duration < 100 THEN '90 - 99.99'
             WHEN duration >= 100 THEN 'Over 100'
           END AS bkt
     FROM dsi_kickstarterscrape_ds_i
GROUP BY bkt
ORDER BY bkt;
# of days
              # of projects
0 - 9.99
                        458
10 - 19.99
                       2267
20 - 29.99
                       5871
30 - 39.99
                      18841
40 - 49.99
                       7307
50 - 59.99
                       3131
60 - 69.99
                       5200
70 - 79.99
                        532
80 - 89.99
                       1177
90 - 99.99
                       1031
```



3. Calculating skewness

Method 1.

Formula:

$$\frac{1}{n} \sum_{i=1}^{n} (x_i - \bar{x})^3$$

$$\frac{1}{s^3}$$

```
WITH calc_mean AS
        (SELECT AVG(duration) AS mean
            FROM dsi_kickstarterscrape_ds_i)
SELECT (SUM(POWER((ds.duration - mn.mean), 3)) / COUNT(ds.duration)) /
            POWER(STDDEV(duration), 3) AS skewness
FROM dsi_kickstarterscrape_ds_i ds, calc_mean mn;
```

Skewness: 1.08

Method 2.

Formula:

$$Skew = \frac{n}{(n-1)*(n-2)} * \sum_{i=1}^{n} (\frac{v_i - \mu}{\sigma})^3$$

Skewness: 1.08

This value indicates that the distribution is **skewed**.

4. Using Oracle procedure **NORMAL_DIST_FIT** (package **DBMS_STAT_FUNCS**) to test how well values in a column fit a normal distribution.

```
DECLARE
    v mean
                NUMBER;
    v_stdev
                NUMBER;
    v sig
               NUMBER;
BEGIN
    SELECT AVG(duration), STDDEV(duration)
      INTO v_mean, v_stdev
      FROM dsi kickstarterscrape ds i;
    dbms output.put line('NORMAL DISTRIBUTION - SHAPIRO WILKS');
    dbms_stat_funcs.normal_dist_fit(
       'C##DEV', 'DSI_KICKSTARTERSCRAPE_DS_I', 'DURATION', 'SHAPIRO_WILKS', v_mean,
                                                                   v stdev, v sig);
    dbms_output.put_line('Mean : ' || round(v_mean, 4));
    dbms_output.put_line('Stddev : ' || round(v_stdev, 4));
    dbms_output.put_line('Sig : ' || to_char(v_sig,'9.9999'));
END;
/
NORMAL DISTRIBUTION - SHAPIRO WILKS
W value : .8853695809734672653967601323116944482802
       : 39.9951
Mean
Stddev : 17.4206
           .0000
Sig
```

The Shapiro–Wilk test, which is used for evaluating whether the observations deviate from the normal curve, yields a value equal to $0.885 \ (P < 0.000)$, thus, the distribution is **not** normal.

5. If you could collect data on another attribute of these projects, what would it be and why?

Answer: I would add a field identifying the creator of the project – to have a possibility to analyse previous projects created by the same creator and to get additional information about the creator. Also, I would like to have information about individual pledges (from a separate dataset, containing project id, backer's id, pledge amount, date and time of each pledge) and about backers (also from a separate dataset) - to get more information about the target audience of each project. I would also like to add fields describing how a project was promoted (platform, number of followers, contacts, number of page views) and a list of keywords describing the project, which might help to understand what attracted backers to a project.

If I could, I would add the following values:

- 1. A field identifying the **owner (creator) of the project** (preferably a USER_ID). I would like to have a possibility to:
 - retrieve historical data: all projects created by that user whether they were successful or failed, project goals, number of backers etc
 - join this dataset to another one, containing information about Kickstarter users that would allow an analyst to retrieve additional information about the project's creator, for example, the date of joining Kickstarter (a more experienced creator can have better chances of success).
- 2. Information about **individual pledges** in a separate dataset, providing mapping between PROJECT_ID and USER_ID of each individual backer project id, backer's id, pledge amount, date and time of each pledge. That might give an analyst an opportunity to find some patterns in project funding. Based on those patterns, some attributes of a project can be adjusted (for example, adding more reward levels).
- 3. Information about **backers** in a separate dataset for example, backer's location (to see if a campaign can reach backers in other states or countries). It would help to get information about each project's target audience.
- 4. For each project, information about how the project was **promoted** (for example, via social media, e-mail distribution etc)
 - Platform (Twitter, Facebook etc)
 - > Number of followers, contacts etc
 - Whether the project was endorsed by Kickstarter
 - For each project page how much traffic the page received (number of page views etc)
- 5. For each project, a list of **keywords** or **tags**, collected from the main page, describing what the project is about. These keywords might help to understand what attracted backers to that particular project.

This additional information might help to better predict whether or not a project will be successful in reaching its funding goal.

Part 2: Qualitative Analysis

Create a presentation using Google Slides (max. 5 slides) using the data above (and additional data from those tables) that make clear recommendations on how people can create a successful Kickstarter campaign.

Be sure to consider the following:

- What's the **best length of time** to run a campaign?
- What's the ideal pledge goal?
- What **type of projects** would be most successful at getting funded?
- Is there an **ideal month/day/time** to launch a campaign?

Google Slide Link:

https://docs.google.com/presentation/d/12NSLnZ7oeCEqm96DVyFrMbZadSBDLIe00CfYyh6bEy8/edit#slide=id.p

1. Preparing data for analysis.

1. Filtering data.

A Kickstarter campaign can have one of the following statuses:

I decided to use for analysis only those projects that have reached their deadline and filtered out all projects with the status 'Live'. Also, I filtered out all projects with statuses 'Canceled' and 'Suspended'. The resulting dataset contains only **successful** and **failed** projects.

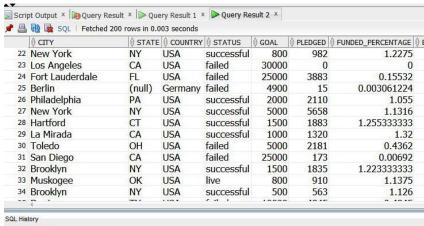
```
DELETE FROM dsi_kickstarterscrape_ds_i
WHERE status IN ('live', 'suspended', 'canceled');
3,974 rows deleted.
```

2. Redefining columns.

In the original dataset, LOCATION values are presented as a combination of city and state (or country – for non-USA locations), separated by a comma: for example, "San Diego, CA" or "Buenos Aires, Argentina". To facilitate data analysis, I replaced LOCATION with 3 separate fields: CITY, STATE and COUNTRY and converted the data type of FUNDED_DATE to TIMESTAMP.

```
CREATE TABLE dsi_kickstarterscrape_ds_sf (
     project_id
     name
                                  nvarchar2(500),
     url
                                 varchar2(200),
     category
                                  varchar2(100),
     subcategory
                                  varchar2(100),
                                  nvarchar2(100),
     city
     state
                                  char(2),
                                  nvarchar2(60),
     country
     status
                                  varchar2(50),
     goal
                                  number,
     pledged
                                  number,
     funded_percentage
                                  number,
     backers
                                  number,
     funded date
                                  timestamp,
     levels
                                 number,
     reward levels
                                  varchar2(1000),
     updates
                                  number,
     comments
                                  number,
     duration
                                  number
)
INSERT INTO dsi_kickstarterscrape_ds_sf
SELECT project_id, name, url, category, subcategory, NULL, NULL, NULL, status, goal, pledged,
       funded_percentage, backers, TO_TIMESTAMP(funded_date, 'Dy, DD Mon YYYY HH24:MI:SS -FF'),
       levels, reward_levels, updates, comments, duration
  FROM dsi_kickstarterscrape_ds_i;
45,815 rows inserted.
```

```
MERGE INTO dsi_kickstarterscrape_ds_sf ds
USING (SELECT project_id, city,
               CASE
                    WHEN LENGTH(state or country) = 2 THEN state or country
                END AS state,
                CASE
                    WHEN LENGTH(state_or_country) > 2 THEN state_or_country
                END AS country
          FROM (SELECT project_id,
                         SUBSTR(location, 1, INSTR(location, ',') - 1) AS city,
                         TRIM(SUBSTR(location, INSTR(location, ',') + 1)) AS state_or_country
                   FROM dsi kickstarterscrape ds i)
ON (sq.project_id = ds.project_id)
WHEN MATCHED THEN
   UPDATE
      SET ds.city = sq.city, ds.state = sq.state,
           ds.country = (CASE
                             WHEN sq.state IS NOT NULL THEN TO NCHAR('USA')
                             ELSE sq.country
                           END);
45,815 rows merged.
Script Output x Query Result x Query Result 1 x Query Result 2 x
📌 📇 🍓 🔯 SQL | Fetched 200 rows in 0.003 seconds
   ♦ CITY
                  $ STATE $ COUNTRY $ STATUS $ GOAL $ PLEDGED $ FUNDED_PERCENTAGE $ B
```



3. Cleaning duplicate values in columns "CATEGORY" and "SUBCATEGORY".

```
SELECT category, COUNT(*) AS num_projects
  FROM dsi_kickstarterscrape_ds_sf
GROUP BY category
ORDER BY 2 DESC;
```

Category	# of projects
Film & Video	12139
Music	10031
Publishing	4150
Art	3684
Theater	2315
Design	1561
Games	1460
Photography	1380
Food	1291
Fashion	1018
Comics	965
Technology	732
Dance	704
Film & Video	411

To correct an obvious data error, I replaced duplicate values 'Film & amp; Video' and 'Film & Video' with a single value 'Film and Video':

```
UPDATE dsi_kickstarterscrape_ds_sf
   SET category = 'Film and Video'
WHERE category LIKE 'Film%';
```

12,550 rows updated.

Category	# of projects
Film and Video	12550
Music	10031
Publishing	4150
Art	3684
Theater	2315
Design	1561
Games	1460
Photography	1380
Food	1291
Fashion	1018
Comics	965
Technology	732
Dance	704

For the column SUBCATEGORY I replaced the following duplicate values:

1. 'Film & amp; Video' and 'Film & Video' with a single value 'Film and Video'

```
UPDATE dsi_kickstarterscrape_ds_sf
   SET subcategory = 'Film and Video'
WHERE subcategory LIKE 'Film%';
2,333 rows updated.
```

2. 'Board & Card Games' and 'Board & Card Games' with a single value 'Board and Card Games'

3. 'Country & amp; Folk' and 'Country & Folk' with a single value 'Country and Folk'

```
UPDATE dsi_kickstarterscrape_ds_sf
    SET subcategory = 'Country and Folk'
WHERE subcategory LIKE 'Country%';
987 rows updated.
```

2. Exploring attributes of successful and failed projects

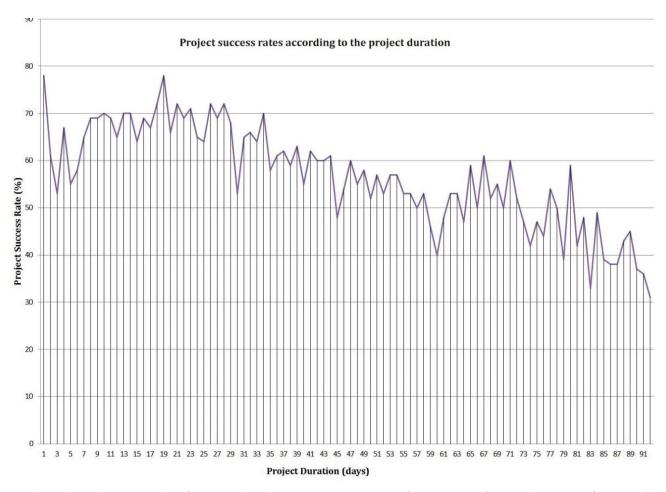
```
WITH
  total rows AS
   (SELECT COUNT(*) AS total row couint
    FROM dsi_kickstarterscrape_ds_sf),
  sf_projects AS
   (SELECT INITCAP(status) AS status, COUNT(*) AS num_projects,
         ROUND(SUM(goal)) AS total goal, ROUND(AVG(goal)) AS avg goal,
         ROUND(SUM(pledged)) AS total pledged, ROUND(AVG(pledged)) AS avg pledged,
         ROUND(AVG(funded_percentage) * 100) AS avg_funded_pct,
           ROUND(AVG(backers)) AS avg backers, ROUND(AVG(levels), 1) AS avg levels,
         ROUND(AVG(updates), 1) AS avg_updates, ROUND(AVG(comments), 1) AS avg_comments,
         ROUND(AVG(duration), 1) AS avg duration
      FROM dsi_kickstarterscrape_ds_sf
     GROUP BY status)
SELECT sf.status AS source,
       TO CHAR(sf.num projects, '999,999') AS num projects,
       ROUND(sf.num projects/t.total row couint * 100) AS pct,
       TO_CHAR(sf.total_goal, '9,999,999,999') AS total_goal,
       TO_CHAR(sf.avg_goal, '999,999') AS avg_goal,
       TO_CHAR(sf.total_pledged, '9,999,999,999') AS total_pledged,
       TO CHAR(sf.avg pledged, '999,999') AS avg pledged,
       sf.avg_funded_pct AS avg_funded_pct,
       sf.avg duration AS avg duration,
       sf.avg_backers AS avg_backers,
       sf.avg_levels as avg_levels,
       sf.avg updates AS avg updates,
       sf.avg_comments AS avg_comments
  FROM sf_projects sf, total_rows t
UNION ALL
SELECT 'All' AS source,
       TO CHAR(COUNT(*), '999,999') AS num projects,
       100 AS pct,
       TO_CHAR(ROUND(SUM(goal)), '9,999,999,999') AS total_goal,
       TO_CHAR(ROUND(AVG(goal)), '999,999') AS avg_goal,
       TO_CHAR(ROUND(SUM(pledged)), '9,999,999,999') AS total_pledged,
       TO_CHAR(ROUND(AVG(pledged)), '999,999') AS avg_pledged,
       ROUND(AVG(funded_percentage) * 100) AS avg_funded_pct,
       ROUND(AVG(duration), 1) AS avg_duration,
       ROUND(AVG(backers)) AS avg_backers,
       ROUND(AVG(levels), 1) AS avg_levels,
       ROUND(AVG(updates), 1) AS avg_updates,
       ROUND(AVG(comments), 1) AS avg_comments
 FROM dsi_kickstarterscrape_ds_sf;
```

SOURCE	NUM_PROJECTS	♦ PCT	TOTAL_GOAL		TOTAL_PLEDGED		AVG_FUNDED_PCT	AVG_DURATION	AVG_BACKERS	AVG_LEVELS	AVG_UPDATES	♦ AVG_COMMENTS
Failed	18,939	45	309,939,807	16,365	16,995,716	897	10	43	13	7.3	1.5	1
Successful	22,902	55	125,659,993	5,487	197,592,764	8,628	353	38	119	8.5	6.7	14.4
All	41,841	100	435,599,800	10,411	214,588,480	5,129	198	40.2	71	8	4.3	8.3

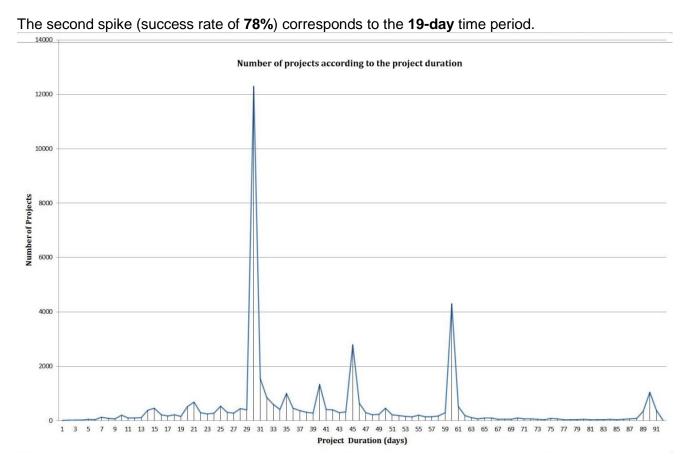
3. What's the best length of time to run a campaign?

Answer: From one week to one month. After one month, the project success rates steadily decline.

А	В	С	D
Project Duration	Project Success Rate	Number of Projects	
1	78	9	
2	61	18	
3	53	15	
4	67	15	
5	55	44	
6	58	38	
7	65	125	
8	69	81	
9	69	64	
10	70	198	
11	69	93	
12	65	102	
13	70	105	
14	70	385	
15	64	451	
16	69	216	
17	67	176	
18	72	212	
19	78	161	
20	66	518	
21	72	685	
22	69	289	
23	71	244	
24	65	282	
25	64	527	
26	72	307	
27	69	272	
28	72	443	
29	68	390	
30	53	12295	
31	65	1544	



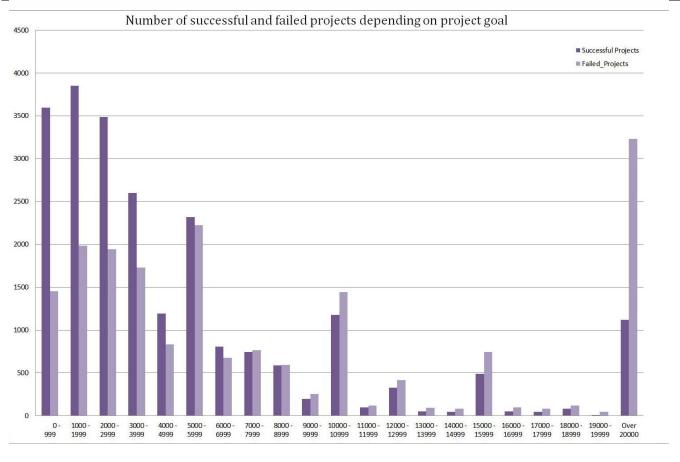
Even though projects running for one day have a success rate of **78%**, very few projects run for one day. The majority of the projects have a duration of **one month**.

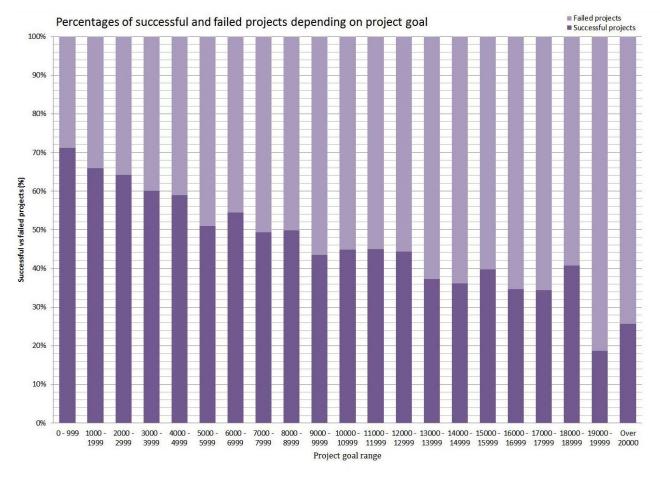


4. What's the ideal pledge goal?

Answer: Ideally, as small as possible. The ideal pledge goal is less than 100 USD – it has the highest success rate – 83%. With a goal amount greater than 7,000 USD, a project has more chances to fail than to succeed.

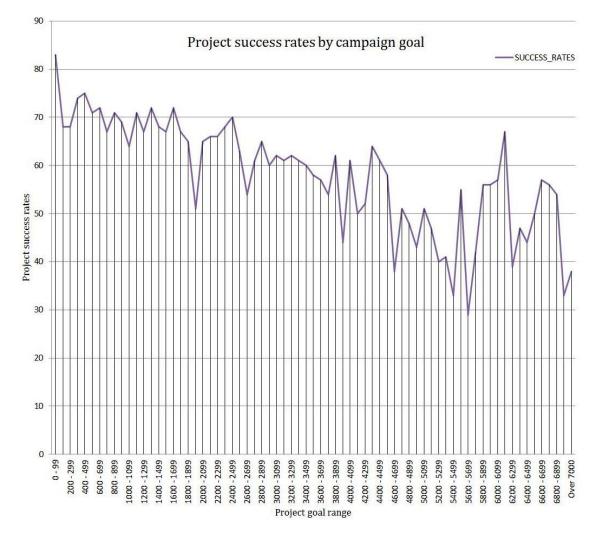
exec generate_query_hist('dsi_kickstarterscrape_ds_sf', 'goal', 20000, 1000)		\$ SUCCESS_RATE	SUCCESS	♦ FAILED♦	NUM_PROJ
exec generate_query_nist(dsi_Mekstarterserupe_ds_si , godi , 20000, 1000)	0 - 999	71	3599	1453	5052
SELECT SUBSTR(bkt, INSTR(bkt, '.') + 1) AS buckets,	1000 - 1999	66	3851	1984	5835
ROUND((COUNT(success)/COUNT(*)) * 100) AS success_rate,	2000 - 2999	64	3489		5434
COUNT(success) AS successful_projects,	3000 - 3999	60	2603		4332
COUNT(failure) AS failed_projects,	4000 - 4999				
COUNT(*) AS num_projects FROM (SELECT CASE		59	1195		2027
WHEN goal BETWEEN 0 AND 999 THEN '001.0 - 999'	5000 - 5999	51	2318		4543
WHEN goal BETWEEN 1000 AND 1999 THEN '002,1000 - 1999'	6000 - 6999	54	810	678	1488
WHEN goal BETWEEN 2000 AND 2999 THEN '003.2000 - 2999'	7000 - 7999	49	746	767	1513
WHEN goal BETWEEN 3000 AND 3999 THEN '004.3000 - 3999'	8000 - 8999	50	589	593	1182
WHEN goal BETWEEN 4000 AND 4999 THEN '005.4000 - 4999'	9000 - 9999	43	196	255	451
WHEN goal BETWEEN 5000 AND 5999 THEN '006.5000 - 5999'	10000 - 10999		1177		2620
WHEN goal BETWEEN 6000 AND 6999 THEN '007.6000 - 6999' WHEN goal BETWEEN 7000 AND 7999 THEN '008.7000 - 7999'		45			
WHEN goal BETWEEN 7000 AND 7999 THEN '000.7000 - 7999'	11000 - 11999		100		222
WHEN goal BETWEEN 9000 AND 9999 THEN '010.9000 - 9999'	12000 - 12999	44	330		744
WHEN goal BETWEEN 10000 AND 10999 THEN '011.10000 - 10999'	13000 - 13999	37	54	91	145
WHEN goal BETWEEN 11000 AND 11999 THEN '012.11000 - 11999'	14000 - 14999	36	48	85	133
WHEN goal BETWEEN 12000 AND 12999 THEN '013.12000 - 12999'	15000 - 15999	40	490	744	1234
WHEN goal BETWEEN 13000 AND 13999 THEN '014.13000 - 13999'	16000 - 16999	35	52	98	150
WHEN goal BETWEEN 14000 AND 14999 THEN '015.14000 - 14999'	17000 - 17999	34	44		128
WHEN goal BETWEEN 15000 AND 15999 THEN '016.15000 - 15999' WHEN goal BETWEEN 16000 AND 16999 THEN '017.16000 - 16999'					
WHEN goal BETWEEN 17000 AND 17999 THEN '018.17000 - 17999'	18000 - 18999	41	82		201
WHEN goal BETWEEN 18000 AND 18999 THEN '019.18000 - 18999'	19000 - 19999	19	11		59
WHEN goal BETWEEN 19000 AND 19999 THEN '020.19000 - 19999'	Over 20000	26	1118	3230	4348
ELSE '99999.Over 20000'					
END AS bkt,					
CASE					
WHEN status = 'successful' THEN 1 END AS success,					
CASE					
WHEN status = 'failed' THEN 1					
END AS failure					
FROM dsi_kickstarterscrape_ds_sf)					
GROUP BY bkt					
ORDER BY bkt;					



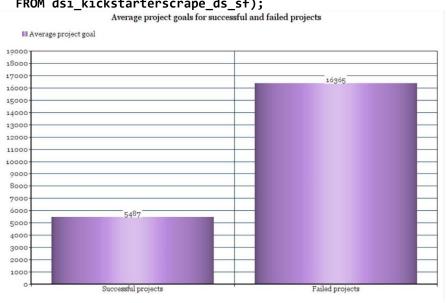


Both graphs show that the lower the project goal amount is, the higher are its chances to be successful. With a goal amount greater than **7,000 USD**, a project has more chances to fail than to succeed.

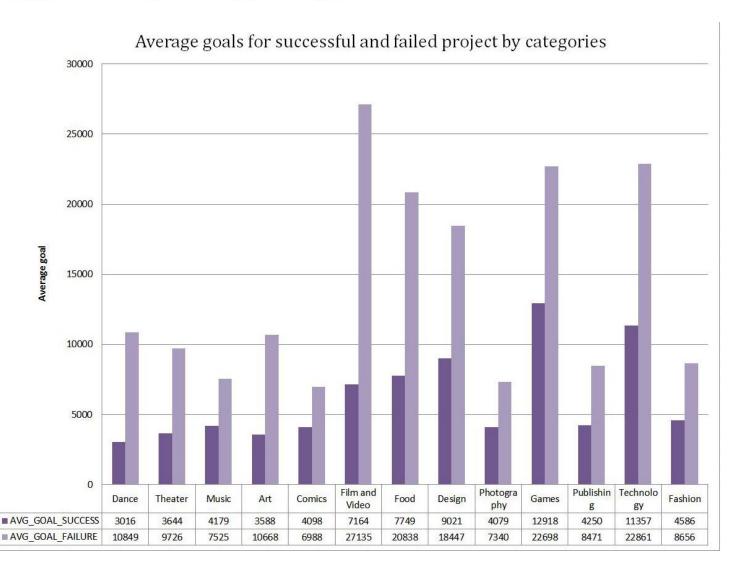
	⊕ BUCKETS	SUCCESS_RATE	SUCCESS	FAILED	NUM_PROJ
exec generate_query_hist('dsi_kickstarterscrape_ds_sf', 'goal', 7000, 100)	0 - 99	83	144	29	173
	100 - 199	68	154	71	225
SELECT SUBSTR(bkt, INSTR(bkt, '.') + 1) AS buckets,	200 - 299	68	259	122	381
ROUND((COUNT(success)/COUNT(*)) * 100) AS success_rate,	300 - 399	74	377	134	511
COUNT(success) AS successful_projects,	400 - 499	75	249	85	334
COUNT(failure) AS failed_projects,	500 - 599	71	1066	428	1494
COUNT(*) AS num_projects	600 - 699	72	385	151	536
FROM (SELECT CASE	700 - 799	67	407	197	604
WHEN goal BETWEEN 0 AND 99 THEN '001.0 - 99'	800 - 899	71	373	151	524
WHEN goal BETWEEN 100 AND 199 THEN '002.100 - 199'	900 - 999	69	185	84	269
WHEN goal BETWEEN 200 AND 299 THEN '003.200 - 299'	1000 - 1099	100	1504	834	2338
WHEN goal BETWEEN 300 AND 399 THEN '004.300 - 399'	1100 - 1199		161	67	2338
WHEN goal BETWEEN 400 AND 499 THEN '005.400 - 499'					
WHEN goal BETWEEN 500 AND 599 THEN '006.500 - 599'	1200 - 1299		455	223	678
WHEN goal BETWEEN 600 AND 699 THEN '007.600 - 699'	1300 - 1399	1900	82	0.000	114
WHEN goal BETWEEN 700 AND 799 THEN '008.700 - 799'	1400 - 1499		76	36	112
WHEN goal BETWEEN 800 AND 899 THEN '009.800 - 899'	1500 - 1599		1161	583	1744
WHEN goal BETWEEN 900 AND 999 THEN '010.900 - 999'	1600 - 1699		146	56	202
WHEN goal BETWEEN 1000 AND 1099 THEN '011.1000 - 1099'	1700 - 1799		106	53	159
WHEN goal BETWEEN 1100 AND 1199 THEN '012.1100 - 1199'	1800 - 1899		124	67	191
WHEN goal BETWEEN 1200 AND 1299 THEN '013.1200 - 1299'	1900 - 1999		35	33	68
WHEN goal BETWEEN 1300 AND 1399 THEN '014.1300 - 1399'	2000 - 2099	65	1587	862	2449
WHEN goal BETWEEN 1400 AND 1499 THEN '015.1400 - 1499'	2100 - 2199	66	60	31	91
WHEN goal BETWEEN 1500 AND 1599 THEN '016.1500 - 1599'	2200 - 2299	66	180	94	274
WHEN goal BETWEEN 1600 AND 1699 THEN '017.1600 - 1699'	2300 - 2399	68	63	29	92
WHEN goal BETWEEN 1700 AND 1799 THEN '018.1700 - 1799'	2400 - 2499	70	71	30	101
WHEN goal BETWEEN 1800 AND 1899 THEN '019.1800 - 1899'	2500 - 2599	63	1287	743	2030
WHEN goal BETWEEN 1900 AND 1999 THEN '020.1900 - 1999'	2600 - 2699	54	40	34	74
WHEN goal BETWEEN 2000 AND 2099 THEN '021.2000 - 2099'	2700 - 2799	61	102	66	168
	2800 - 2899		73	40	113
•••	2900 - 2999		24	16	40
WHEN goal BETWEEN 6500 AND 6599 THEN '066.6500 - 6599'	3000 - 3099		1549	966	2515
WHEN goal BETWEEN 6600 AND 6699 THEN '067.6600 - 6699'	3100 - 3199		27	17	44
WHEN goal BETWEEN 6700 AND 6799 THEN '068.6700 - 6799'	3200 - 3299		90	55	145
WHEN goal BETWEEN 6800 AND 6899 THEN '069.6800 - 6899'	3300 - 3399	2000	84	54	138
WHEN goal BETWEEN 6900 AND 6999 THEN '070.6900 - 6999'	3400 - 3499	20.70	25	17	42
ELSE '99999.Over 7000'	3500 - 3599		657	483	1140
END AS bkt,	5500 - 3599	28	03/	463	1140
CASE					
WHEN status = 'successful' THEN 1	6500 - 6599	50	153	154	307
END AS success,	6600 - 6699		12	9	21
CASE	6700 - 6799		10	8	18
WHEN status = 'failed' THEN 1					
END AS failure	6800 - 6899		13	11	24
FROM dsi_kickstarterscrape_ds_sf)	6900 - 6999		5	10	15
GROUP BY bkt	Over 7000	38	5040	8095	13135
order by bkt;					



The ideal pledge goal is less than 100 USD - it has the highest success rate - 83%.



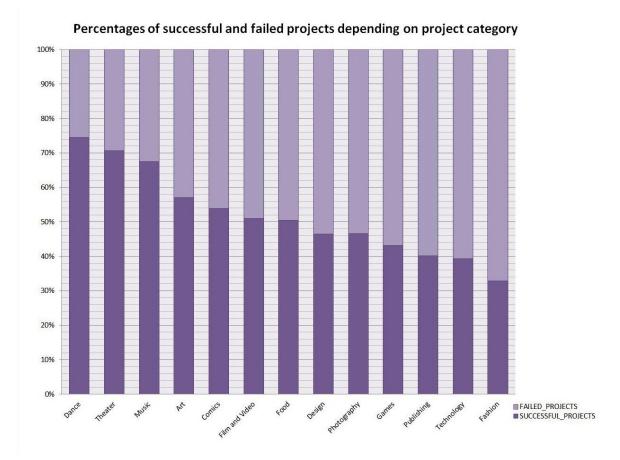
	SUCCESS_RATE AVG_	GOAL_SUCCESS AVG_	GOAL_FAILURE
1 Dance	75	3016	10849
² Theater	71	3644	9726
3 Music	68	4179	7525
4 Art	57	3588	10668
5 Comics	54	4098	6988
6 Film and Video	51	7164	27135
7 Food	51	7749	20838
8 Design	47	9021	18447
9 Photography	47	4079	7340
10 Games	43	12918	22698
11 Publishing	40	4250	8471
12 Technology	39	11357	22861
13 Fashion	33	4586	8656



5. What type of projects would be most successful at getting funded?

Answer: Categories DANCE, THEATER and MUSIC would be the most successful at getting funded. If we consider subcategories, then DANCE (not divided into subcategories), MUSIC (INDIE ROCK) and MUSIC (COUNTRY and FOLK) would be the most successful, with success rate 75%.

	SUCCESS_RATE	SUCCESSFUL_PROJECTS		♦ NUM_PROJECTS
1 Dance	75	525	179	704
² Theater	71	1636	679	2315
3 Music	68	6775	3256	10031
4 Art	57	2102	1582	3684
5 Comics	54	520	445	965
6 Film and Video	51	6400	6150	12550
7 Food	51	652	639	1291
8 Design	47	726	835	1561
9 Photography	47	643	737	1380
10 Games	43	631	829	1460
11 Publishing	40	1669	2481	4150
12 Technology	39	288	444	732
13 Fashion	33	335	683	1018



```
SELECT subcat AS subcategories,
    ROUND((COUNT(success)/COUNT(*)) * 100) AS success_rate,
    COUNT(*) AS num_projects

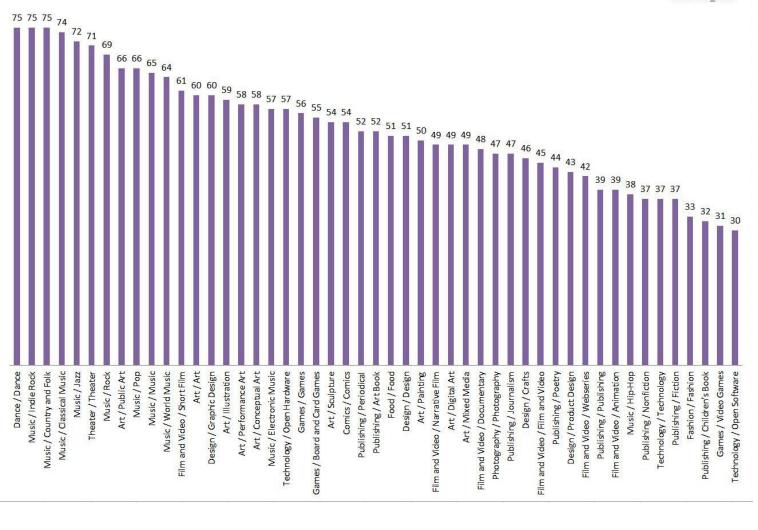
FROM (SELECT category || ' / ' || subcategory AS subcat,
    CASE
    WHEN status = 'successful' THEN 1
    END AS success
    FROM dsi_kickstarterscrape_ds_sf)

GROUP BY subcat
```

GROUP BY subcat
ORDER BY success_rate DESC;

Category / Subcategory	Success rate # of proje	ects_
Dance / Dance	75	704
Music / Indie Rock	75	1812
Music / Country and Folk	75	987
Music / Classical Music	74	430
Music / Jazz	72	414
Theater / Theater	71	2315
Music / Rock	69	1627
Art / Public Art	66	509
Music / Pop	66	690
Music / Music	65	3000
Music / World Music	64	382
Film and Video / Short Film	61	3735
Art / Art	60	1008
Design / Graphic Design	60	163
Art / Illustration	59	187
Art / Performance Art	58	460
Art / Conceptual Art	58	167
Music / Electronic Music	57	269
Technology / Open Hardware	57	170
Games / Games	56	239
Games / Board and Card Games	55	471
Art / Sculpture	54	329
Comics / Comics	54	965
Publishing / Periodical	52	263
Publishing / Art Book	52	301
Food / Food	51	1291
Design / Design	51	260
Art / Painting	50	483
Film and Video / Narrative Fi	lm 49	1408
Art / Digital Art	49	134
Art / Mixed Media	49	407
Film and Video / Documentary	48	3674
Photography / Photography	47	1380
Publishing / Journalism	47	404
Design / Crafts	46	228
Film and Video / Film and Vid	eo 45	2333
Publishing / Poetry	44	200
Design / Product Design	43	910
Film and Video / Webseries	42	1024
Publishing / Publishing	39	616
Film and Video / Animation	39	376
Music / Hip-Hop	38	420
Publishing / Nonfiction	37	881
Technology / Technology	37	328
Publishing / Fiction	37	943
Fashion / Fashion		1018
Publishing / Children's Book	32	542
Games / Video Games	31	750
Technology / Open Software	30	234
 •		



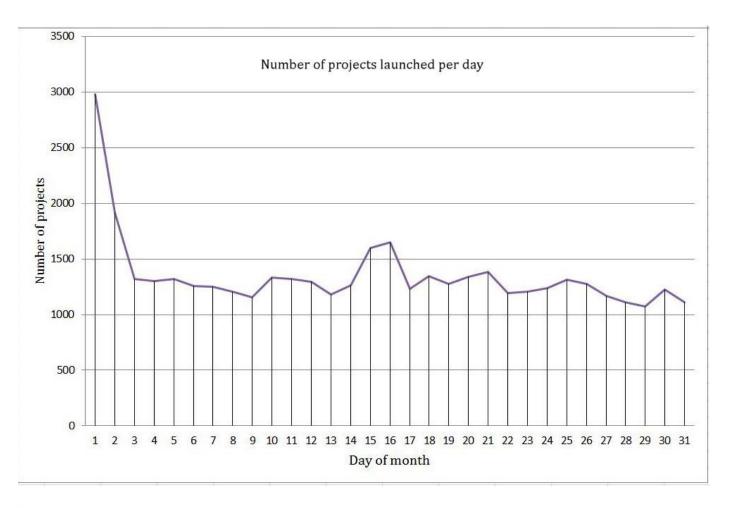


6. Is there an ideal month/day/time to launch a campaign?

Answer: Launching a campaign at the end of a month, and especially at the end of a year, would decrease its chances of successfully reaching its financial goal.

The best months to launch a campaign are MARCH, APRIL and NOVEMBER, and the worst month is DECEMBER. It appears that the best day to start a project is the 12-th day of a month. The days to avoid: 10-th, 20-th, 30-th days of a month as well as the last 5 days of a month.

NUM_PROJECTS	SUCCESS_RATE	DAY_OF_MONTH
1292	60	12
1317	58	5
1916	58	2
2978	57	1
1648	57	16
1157	57	9
1207	56	23
1232	56	17
1321	56	3
1386	56	21
1601	56	15
1273	55	19
1180	55	13
1265	54	14
1192	54	22
1301	54	4
1316	54	25
1344	54	18
1254	54	6
1207	53	8
1278	53	26
1321	53	11
1238	53	24
1252	53	7
1341	52	20
1333	52	10
1223	52	30
1168	52	27
1076	51	29
1114	51	31
1110	51	28

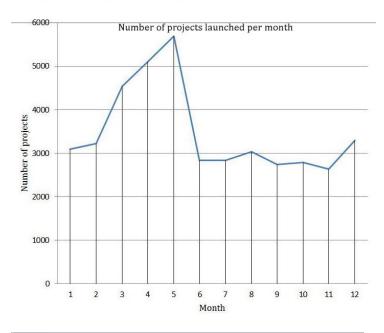




It appears that the best day to start a project is the **12-th day** of a month.

The graph also shows that it is better **not** to start a project on the **10-th**, **20-th**, **30-th days** of a month as well as in **the last 5 days** of a month.

	♦ NUM_PROJECTS	SUCCESS_RATE	∯ MONTH
1	5108	57	4
,	4539	57	3
	2634	57	11
-	3224	55	2
,	2789	55	10
,	3037	55	8
,	3093	54	1
)	2840	54	6
	2748	54	9
	2841	53	7
,	5696	53	5
1	3292	52	12





The best months to launch a campaign are **March**, **April** and **November**, and the worst month is **December**.