#### IDH30305

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### KICSTARTER PREDICTION MODEL

### Introduction

Kickstarter "help bring creative projects to life". It is an American corporation devoted to crowdfunding projects worldwide through their platform. Kickstarter was funded in 2009 and have been bringing creative projects and startups to life ever since. Their business model is sustainable thanks to general public engaging in different projects, or, as they call it, "pledging", in hopes that they will get something in return from the company. There is a rigorous process for creators to be featured on Kickstarter's platform, which has built confidence among supporters (backers) to contribute monetarily (pledge) with such projects, making Kickstarter's business model sustainable. There is a deadline established by which the startup must reach their monetary goal or, otherwise, backers won't be charged for the money they pledged (get to keep their money).

### Data

□ '/content/drive/My Drive'

#Here we defined the the dataset as df in a dataframe.
df = pd.read\_csv("Data2.csv")

#Head allows us to see first 5 rows. Each column represents an important factor of a df.head()

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	ID	name	category	main_category	currency	deadline	goal
0	1000002330	The Songs of Adelaide & Abullah	Poetry	Publishing	GBP	10/9/2015 11:36	1000.(
1	1000004038	Where is Hank?	Narrative Film	Film & Video	USD	2/26/2013 0:20	45000.0
2	1000007540	ToshiCapital Rekordz Needs Help to Complete Album	Music	Music	USD	4/16/2012 4:24	5000.0
3	1000011046	Community Film Project: The Art of Neighborhoo	Film & Video	Film & Video	USD	8/29/2015 1:00	19500.(
Л	1000014025	Monarch	Doctourante	Food	HGD	4/1/2016	50000 (

#Df.info gave us infor about the columns and the data type in each column. Some column
df.info()

```
Class 'pandas.core.frame.DataFrame'>
   RangeIndex: 999 entries, 0 to 998
   Data columns (total 13 columns):
   ID
                      999 non-null int64
   name
                      999 non-null object
   category
                      999 non-null object
   main category
                      999 non-null object
                      999 non-null object
   currency
   deadline
                      999 non-null object
                      999 non-null float64
   goal
   launched
                      999 non-null object
                      999 non-null float64
   pledged
   state
                      999 non-null object
                      999 non-null int64
   backers
   country
                      999 non-null object
   usd pledged
                      986 non-null float64
   dtypes: float64(3), int64(2), object(8)
   memory usage: 101.5+ KB
```

## Data Cleaning

```
#missing_values are definied as 'n/a', '--', 'na'
missing_values = ["n/a", "--", "na"]

# Present working directory
pwd

[] '/content/drive/My Drive'

#We redefined the df again to exclude the missing values.
df = pd.read_csv("Data2.csv")

df = pd.read_csv("Data2.csv", na_values = missing_values)

#Full dataset
df

[]
```

		Ya'll come an				2.29
82	1005787932	Hotdog Yogatote	Product Design	Design	USD	4/2/2014 21:39
83	1005790478	Travel Far: A Guide to the Out- of-Body Expe	Nonfiction	Publishing	USD	4/12/2015 0:00
84	1005800160	Who is Nellie Bly?	Painting	Art	USD	8/5/2012 5:17
85	100580052	Get It On The Shelf!	Fiction	Publishing	USD	7/3/2011 1:30
86	1005808602	Help Us Record Our Debut EP "Mayday"	Music	Music	USD	6/23/2011 2:03
87	1005820080	The Million Pound Shirt	Fashion	Fashion	GBP	11/25/2015 22:00

#To see how many missing values (NaN) we have in each column.
df.isnull().sum()

```
0
ID
name
                     0
                     0
category
main category
                     0
currency
deadline
                     0
                     0
goal
launched
                     0
pledged
                     0
state
                     0
backers
                     0
country
                     0
usd pledged
                    13
dtype: int64
```

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df.columns

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from pandas import Series, DataFrame

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df.isnull().sum()

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ID	0
	•
name	0
category	0
main_category	0
currency	0
deadline	0
goal	0
launched	0
pledged	0

df.dropna()

₽

18:06				•		
10/8/2016 2:00	USD	Design	Product Design	Ledr workbook: one tough journal!	1000117861	27
8/22/2015 3:09	AUD	Design	Product Design	Feather Cast Furled Fly Fishing Leaders	1000120151	28
3/24/2013 0:07	USD	Art	Public Art	BB130A	1000120287	29
				GBS Detroit		

GBS Detroit

df.isnull().sum()

ID	0
name	0
category	0
main_category	0
currency	0
deadline	0
goal	0
launched	0
pledged	0
state	0
backers	0
country	0
usd pledged	13
dtype: int64	
	name category main_category currency deadline goal launched pledged state backers country usd pledged

Darker Snage of William 200 3/31/2014

df.dropna(how='any')

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		ID	name	category	main_category	currency	deadline
	0	1000002330	The Songs of Adelaide & Abullah	Poetry	Publishing	GBP	10/9/2015 11:36
	1	1000004038	Where is Hank?	Narrative Film	Film & Video	USD	2/26/2013 0:20
	2	1000007540	ToshiCapital Rekordz Needs Help to Complete Album	Music	Music	USD	4/16/2012 4:24
	3	1000011046	Community Film Project: The Art of Neighborhoo	Film & Video	Film & Video	USD	8/29/2015 1:00
	4	1000014025	Monarch Espresso Bar	Restaurants	Food	USD	4/1/2016 13:38
	5	1000023410	Support Solar Roasted Coffee & Green Energy!	Food	Food	USD	12/21/2014 18:30
	6	1000030581	Chaser Strips. Our Strips make Shots their B*tch!	Drinks	Food	USD	3/17/2016 19:05
	7	1000034518	SPIN - Premium Retractable In- Ear Headphones w	Product Design	Design	USD	5/29/2014 18:14
			STUDIO IN THE				0/40/0044
df.i	snull	().sum()					
₽	ID  name  category  main_category  currency  deadline  goal  launched  pledged  state  backers  country  usd pledged  dtype: int64		0 0 0 0 0 0 0 0 0 0 0 0	Design	Design	IISD.	LI LUI LU I U
#To		n specific re				·	

#To see an specific row
df.iloc[150]

```
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    ID
                                             1000694855
    name
                        STREETFIGHTERZ WHEELIE MURICA
    category
                                           Film & Video
                                           Film & Video
    main category
    currency
                                                     USD
    deadline
                                         9/20/2014 6:59
    goal
                                                    6500
    launched
                                         8/6/2014 21:28
    pledged
                                                     555
    state
                                              undefined
    backers
                                                       0
    country
                                                   N, "0
    usd pledged
                                                    NaN
    Name: 150, dtype: object
#To drop rows with any NaN value
df.dropna(axis=0, how='any', inplace = True)
df.isnull().sum()
                        0
Гэ
    ID
    name
                        0
    category
                        0
    main category
                        0
    currency
                        0
    deadline
    goal
                        0
    launched
                        0
    pledged
                        0
    state
                        0
    backers
                        0
    country
    usd pledged
    dtype: int64
df.columns = ['ID', 'name', 'category', 'main_category', 'currency', 'deadline', 'goal'
#number of unique values in all columns
print(df.nunique())
    ID
                       986
Гэ
                       986
    name
    category
                       124
    main category
                        15
    currency
                        12
    deadline
                       985
    goal
                       192
    launched
                       986
    pledged
                       675
    state
                         5
    backers
                       234
                        19
    country
    usd pledged
                       710
```

dtype: int64

```
#Distribution of data across state
percent dist = round(df["state"].value counts() / len(df["state"]) * 100,2)
print("State Percent: ")
print(percent_dist)
# Filtering only for successful and failed projects# Filte
kick projects = df[(df['state'] == 'failed') | (df['state'] == 'successful')]
#converting 'successful' state to 1 and failed to 0
kick_projects['state'] = (kick_projects['state'] == 'successful').astype(int)
print(kick projects.shape)

    State Percent:

    failed
                   50.81
                   38.24
    successful
    canceled
                    8.82
                    1.83
    live
    suspended
                    0.30
    Name: state, dtype: float64
    (878, 13)
    /usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:9: SettingWithCor
    A value is trying to be set on a copy of a slice from a DataFrame.
    Try using .loc[row indexer,col indexer] = value instead
    See the caveats in the documentation: http://pandas.pydata.org/pandas-docs/sta
      if __name__ == '__main__':
#checking distribution of projects across various main categories
kick projects.groupby(['main category','state']).size()
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```

main_category	state	
Art	0	46
	1	40
Comics	0	14

# This line of code adds a column to the dataframe. The column is a true or false co df['TF']= df['usd pledged']>= df['goal']

df.head()

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goal	deadline	currency	main_category	category	name	ID	
1000.(	10/9/2015 11:36	GBP	Publishing	Poetry	The Songs of Adelaide & Abullah	1000002330	0
45000.0	2/26/2013 0:20	USD	Film & Video	Narrative Film	Where is Hank?	1000004038	1
5000.0	4/16/2012 4:24	USD	Music	Music	ToshiCapital Rekordz Needs Help to Complete Album	1000007540	2
19500.(	8/29/2015 1:00	USD	Film & Video	Film & Video	Community Film Project: The Art of Neighborhoo	1000011046	3
50000.0	4/1/2016 13:38	USD	Food	Restaurants	Monarch Espresso Bar	1000014025	4

maincategory = pd.get\_dummies(df['main\_category'])

maincategory

 $\Box$ 

	Art	Comics	Crafts	Dance	Design	Fashion	Film & Video	Food	Games	Journalis
0	0	0	0	0	0	0	0	0	0	(
1	0	0	0	0	0	0	1	0	0	(
2	0	0	0	0	0	0	0	0	0	(
3	0	0	0	0	0	0	1	0	0	(
4	0	0	0	0	0	0	0	1	0	(
5	0	0	0	0	0	0	0	1	0	(
6	0	0	0	0	0	0	0	1	0	(
7	0	0	0	0	1	0	0	0	0	(
8	0	0	0	0	0	0	1	0	0	(
9	0	0	0	0	0	0	0	0	0	(
10	0	0	0	0	0	0	0	0	0	(
11	0	0	1	0	0	0	0	0	0	(
12	0	0	0	0	0	0	0	0	1	(
13	0	0	0	0	1	0	0	0	0	(
14	0	1	0	0	0	0	0	0	0	(
15	0	0	0	0	0	0	0	0	0	(
16	0	0	0	0	0	0	0	0	0	(
17	0	0	0	0	0	0	0	1	0	(
18	0	0	0	0	0	1	0	0	0	(
19	0	0	0	0	0	0	0	0	0	(
20	0	0	0	0	0	0	0	1	0	(
04	^	_	^	^	^	^	^	^	^	,

#We replaced the column main\_category with integers so we can run logistical regress
>>> df.replace(['Art', 'Comics','Crafts','Dance', 'Design', 'Fashion', 'Film & Video

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	ID	name	category	main_category	currency	deadline
0	1000002330	The Songs of Adelaide & Abullah	Poetry	13	GBP	10/9/2015 11:36
1	1000004038	Where is Hank?	Narrative Film	7	USD	2/26/2013 0:20
2	1000007540	ToshiCapital Rekordz Needs Help to Complete Album	11	11	USD	4/16/2012 4:24
3	1000011046	Community Film Project: The Art of Neighborhoo	7	7	USD	8/29/2015 1:00
4	1000014025	Monarch Espresso Bar	Restaurants	8	USD	4/1/2016 13:38
5	1000023410	Support Solar Roasted Coffee & Green Energy!	8	8	USD	12/21/2014 18:30
6	1000030581	Chaser Strips. Our Strips make Shots their B*tch!	Drinks	8	USD	3/17/2016 19:05
7	1000034518	SPIN - Premium Retractable In- Ear Headphones w	Product Design	5	USD	5/29/2014 18:14
8	100004195	STUDIO IN THE SKY - A Documentary Feature Film	Documentary	7	USD	8/10/2014 21:55
9	100004721	Of Jesus and Madmen	Nonfiction	13	CAD	10/9/2013 18:19
10	100005484	Lisa Lim New CD!	Indie Rock	11	USD	4/8/2013 6:42
11	1000055792	The Cottage Market	3	3	USD	10/2/2014 17:11
•	tic Pear	G-Spot Place for Gamers to	^	^	1100	3/25/2016

# Logistic Regression

In this section, three different machine learning models for classification will be applied to the data, in

order to create a model to classify projects into successes and failures.

```
X = df[['main_category', 'goal', 'backers']]
```

X.head()

₽		main_category	goal	backers
	0	Publishing	1000.0	0
	1	Film & Video	45000.0	3
	2	Music	5000.0	1
	3	Film & Video	19500.0	14
	4	Food	50000.0	224

```
x = X.replace(['Art', 'Comics','Crafts','Dance', 'Design', 'Fashion', 'Film & Video'
```

 $\mbox{\ensuremath{\mbox{\#}}} x$  is our redefined adjusted data set that only includes numbers and the three x-var x

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	main_category	goal	backers
0	13	1000.0	0
1	7	45000.0	3
2	11	5000.0	1
3	7	19500.0	14
4	8	50000.0	224
5	8	1000.0	16
6	8	25000.0	40
7	5	125000.0	58
8	7	65000.0	43
9	13	2500.0	0
10	11	12500.0	100
11	3	5000.0	0
12	9	200000.0	0

```
#We created a numpy arrays to facilitate regression.
```

```
x = np.array(x)
x[:3]
```

$$\# Our \ Y \ value \ is the sucess of the kickstarter which we had defined earlier using the y = df[['TF']]$$

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y.head()

- 1 False
- 2 False
- 3 False
- 4 True

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```
y = np.array(y)
y[:3]
```

```
array([[False],
Гэ
            [False],
            [False]])
from sklearn.linear model import LogisticRegression
from sklearn.model_selection import train_test_split
# This logistc regression.
x train, x test, y train, y test = train test split(x,y, test size=0.2, random state
logreg = LogisticRegression()
logreg.fit(x train,y train)
   /usr/local/lib/python3.6/dist-packages/sklearn/linear model/logistic.py:433: F
      FutureWarning)
    /usr/local/lib/python3.6/dist-packages/sklearn/utils/validation.py:761: DataCc
      y = column or 1d(y, warn=True)
    LogisticRegression(C=1.0, class_weight=None, dual=False, fit_intercept=True,
               intercept_scaling=1, max_iter=100, multi_class='warn',
               n_jobs=None, penalty='12', random_state=None, solver='warn',
               tol=0.0001, verbose=0, warm start=False)
# Making predictions
y hat train = logreg.predict(x train)
y hat test = logreg.predict(x test)
print("Logistic regression score for training set:", round(logreg.score(x train, y t
print("Logistic regression score for test set:", round(logreg.score(x_test, y_test),
   Logistic regression score for training set: 0.8566
    Logistic regression score for test set: 0.83333
```