

Bitcoin Sentiment Analysis



Team 10 Presentation



Chris Messer

Consultant at Deloitte



Erin Abbott

Business Consultant



Devyn Byrd

Comp Sci Grad Student

Agenda

- Project Background
 - Bitcoin
 - Sentiment Analysis
- Hypothesis
- Data Preparation
- Planned Approach

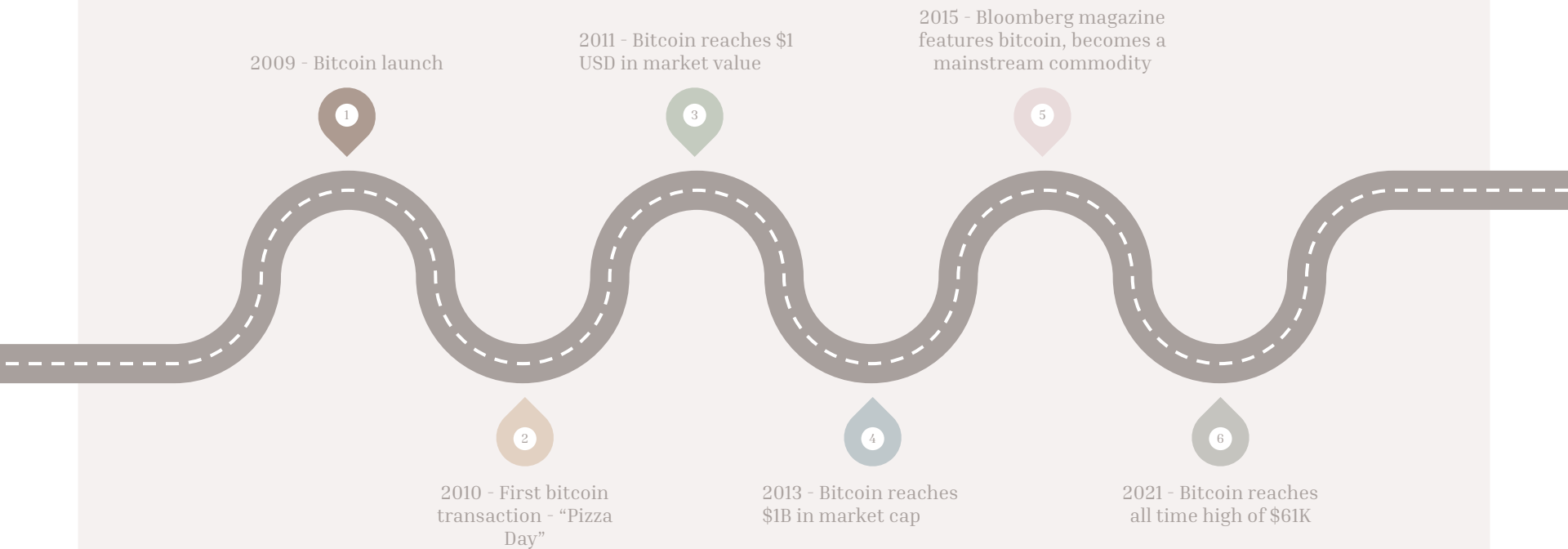


Project Background

What is bitcoin? What is Sentiment Analysis?



Bitcoin



Sentiment Analysis



Extract

Extract the data we would like to analyze

- Twitter Data
- Reddit Data

Tokenize

Tokenization in NLP is the process of breaking up text into smaller pieces called tokens. The tokens can then be quantitatively transformed and analyzed

Analyze

Transform the tokens into quantitative measures using Natural Language Processing and Machine Learning to extract the sentiment of the text

Choosing a Sentiment Model

- Different Approaches
 - Neural Networks
 - Rule Based
 - Machine Learning
 - Hybrid Approaches

Example

"Bitcoin is a terrible investment, I don't know why anyone would buy it."

-->

Sentiment of text:

```
{'neg': 0.205,  
 'neu': 0.795,  
 'pos': 0.0,  
 'compound': -0.4767}
```

Sentiment Tagging

Now we need to tag sentiment score for each of the reddit comments. Looking at the source for the twitter data (Which is already pre-trained model from vaderSentiment. To keep consistent, we will use the same approach.

First lets look at a sample of how it tags sentences.

```
from vaderSentiment.vaderSentiment import SentimentIntensityAnalyzer  
sentiment = SentimentIntensityAnalyzer()  
text_1 = "Bitcoin is a terrible investment, I don't know why anyone would buy it."  
text_2 = "Historically, bitcoin has average returns."  
text_3 = "Bitcoin is an amazing advancement in technology."  
sent_1 = sentiment.polarity_scores(text_1)  
sent_2 = sentiment.polarity_scores(text_2)  
sent_3 = sentiment.polarity_scores(text_3)  
print("Sentiment of text 1:", sent_1)  
print("Sentiment of text 2:", sent_2)  
print("Sentiment of text 3:", sent_3)
```

```
Sentiment of text 1: {'neg': 0.205, 'neu': 0.795, 'pos': 0.0, 'compound': -0.4767}  
Sentiment of text 2: {'neg': 0.0, 'neu': 1.0, 'pos': 0.0, 'compound': 0.0}  
Sentiment of text 3: {'neg': 0.0, 'neu': 0.612, 'pos': 0.388, 'compound': 0.5859}
```

```
# define a function to use pandas.apply() on  
def calc_sentiment(row):  
    try:  
        txt = row['body']  
        sent = sentiment.polarity_scores(txt)  
    except:  
        sent = 0
```

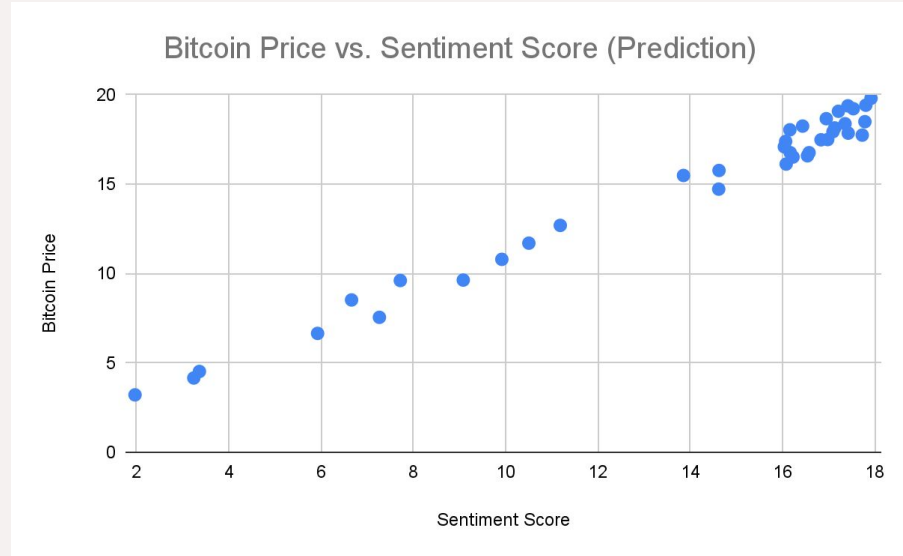

Hypothesis

How do bitcoin and sentiment around bitcoin correlate?

A large white number 2 is centered over a square image. The image shows several dried, golden-brown reeds or grasses against a soft, out-of-focus background. The entire slide has a light beige background with a subtle horizontal band of slightly darker beige across the middle.

Hypothesis

- Positive correlation between sentiment of tweets/posts and Bitcoin price



Data Preparation

How should we transform the data?

A large white number 3 is centered over a square image. The image shows several dried, feathery reeds or grasses against a muted, brownish-grey background. The reeds are light tan and have a soft, textured appearance. The overall aesthetic is minimalist and natural.

Reddit Sentiment Analysis

Extract

The data we will use for this analysis has already been prepared. See sources cited.

Transform

Several data transformation steps must occur:

- Align the date range
- Remove Symbols, URLs, numbers
- Language standardization

Tag

We will use the VaderSentiment Tagging package, as the it was used in the twitter data set.

Aggregate

Lastly, aggregate the reddit comments at various intervals to use it in the final regression model.



Reddit Sentiment Analysis Results

Jupyter Notebook

```
In [5]: import os
import pandas as pd
import transformers
```

```
In [6]: # bring in the data
btred= pd.read_csv('../Data/bitcoin_reddit_all.csv')
```

```
/var/folders/f3/g1154c6d5hb7y4_s6bzsyw8m0000gn/T/ipykernel_65866/1397401860.py:1: DtypeWarning:
ecify dtype option on import or set low_memory=False.
  btred= pd.read_csv('../Data/bitcoin_reddit_all.csv')
```

Data Prep

Let's first inspect the data

```
In [7]: btred.head()
```

```
Out[7]:
```

	Unnamed: 0	datetime	date	author	subreddit	created_utc	score	controversiality
0	0	2014-06-26 16:49:41	2014-06-26	HonorConnor	AskReddit	1.403801e+09	162.0	0.0
1	1	2014-05-17 23:30:36	2014-05-17	Talvoren	AskReddit	1.400369e+09	75.0	0.0
2	2	2014-12-18 04:54:48	2014-12-18	ninjoe87	Outdoors	1.418878e+09	-4.0	0.0
3	3	2014-04-30 00:24:16	2014-04-30	fathergrigori54	tf2	1.398817e+09	13.0	0.0
4	4	2014-07-07 16:06:21	2014-07-07	Draber-Bien	starcraft	1.404749e+09	19.0	0.0

Check how many records it is

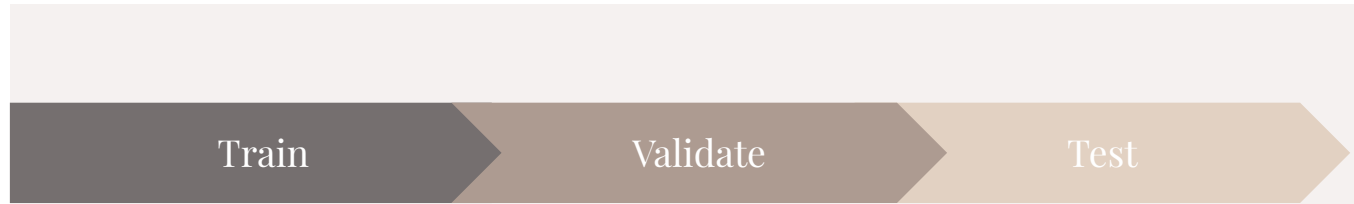
Planned Approach

What should we do with the data?



4

Approach



Model and parameter selection, split the data into train/test/validate sections and train the selected models

Use different models hyperparameters and independent variables to choose the best model

Compare the different models against one another



Train

- Models
 - Linear Regression
 - Logistic Regression
- Parameters
 - Open/close price at $t-1$
 - Reddit sentiment at $t-1$
 - Aggregate by subreddit?
 - Twitter sentiment at $t-1$
 - Reddit/Twitter content volume

Train (contd.)

- Train/Validate/Test Split
 - Time series data
 - 60/20/20 split on time series

Validate

- Evaluation of the models
 - Linear Regression
 - Adjusted R^2
 - Elastic Net Variable Selection
 - Logistic Regression
 - ROC & AUC
 - EN Variable Selection
 - Hetero Skedacity

Test

- Compare models against one another
 - How often is each model correct?
 - How correct was it?

Sources

Cambria, E., Das, D., Bandyopadhyay, S., & Feraco, A. (Eds.). (2017). Chapter 1: Affective Computing and Sentiment Analysis. In *A Practical Guide to Sentiment Analysis* (pp. 1–2). essay, Springer.

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