

News Headlines Sentiment

Use the news api to pull the latest news articles for bitcoin and ethereum and create a DataFrame of sentiment scores for each coin.

Use descriptive statistics to answer the following questions:

1. Which coin had the highest mean positive score?
2. Which coin had the highest negative score?
3. Which coin had the highest positive score?

```
[1]: # Initial imports
import os
import pandas as pd
from dotenv import load_dotenv
from nltk.sentiment.vader import SentimentIntensityAnalyzer
analyzer = SentimentIntensityAnalyzer()

%matplotlib inline
```

```
[3]: # Read your api key environment variable
# YOUR CODE HERE!
```

```
[4]: # Create a newsapi client
# YOUR CODE HERE!
```

```
[6]: # Fetch the Bitcoin news articles
# YOUR CODE HERE!
```

```
[7]: # Fetch the Ethereum news articles
# YOUR CODE HERE!
```

```
[8]: # Create the Bitcoin sentiment scores DataFrame
# YOUR CODE HERE!
```

	Compound	Negative	Neutral	Positive	text
0	0.0516	0.900	0.036	0.064	Cryptocurrency exchange Binance has resumed tr...
1	0.3818	0.943	0.000	0.057	Bitcoin is now trading at around \$8,130, up a ...
2	-0.2263	0.888	0.065	0.047	Binance has vowed to raise the quality of its ...
3	0.3612	0.937	0.000	0.063	A new payment network called Flexa is launchin...
4	-0.6486	0.897	0.103	0.000	If you thought that the theft of 7,000 bitcoin...

```
[9]: # Create the ethereum sentiment scores DataFrame
# YOUR CODE HERE!
```

	Compound	Negative	Neutral	Positive	text
0	-0.3919	0.801	0.140	0.059	President Trump tweeted insults at Twitter aga...
1	0.1779	0.961	0.000	0.039	After announcing that they were launching a ma...
2	0.0000	1.000	0.000	0.000	Captain Kirk and neo-Dadaists. Repugnant marke...
3	-0.8020	0.717	0.217	0.066	So long as cryptocurrency exists, so too will ...
4	-0.6486	0.897	0.103	0.000	If you thought that the theft of 7,000 bitcoin...

```
[10]: # Describe the Bitcoin Sentiment
# YOUR CODE HERE!
```

	Compound	Negative	Neutral	Positive
count	17.000000	17.000000	17.000000	17.000000
mean	0.024835	0.882118	0.049471	0.068412
std	0.523138	0.082548	0.054700	0.087631
min	-0.822500	0.691000	0.000000	0.000000
25%	-0.318200	0.849000	0.000000	0.000000
50%	0.000000	0.897000	0.051000	0.047000
75%	0.381800	0.943000	0.065000	0.064000
max	0.921700	1.000000	0.218000	0.267000

```
[11]: # Describe the Ethereum Sentiment
# YOUR CODE HERE!
```

	Compound	Negative	Neutral	Positive
count	20.000000	20.000000	20.000000	20.000000
mean	0.076370	0.873400	0.057900	0.068750
std	0.518197	0.092956	0.080454	0.056343
min	-0.918200	0.698000	0.000000	0.000000
25%	-0.267700	0.815250	0.000000	0.019500
50%	0.253500	0.877500	0.000000	0.063500
75%	0.426225	0.940250	0.112250	0.107500
max	0.769500	1.000000	0.240000	0.180000

Questions:

Q: Which coin had the highest mean positive score?

A:

Q: Which coin had the highest compound score?

A:

Q: Which coin had the highest positive score?

A:

Tokenizer

In this section, you will use NLTK and Python to tokenize the text for each coin. Be sure to:

1. Lowercase each word
2. Remove Punctuation
3. Remove Stopwords

```
[12]: from nltk.tokenize import word_tokenize, sent_tokenize
from nltk.corpus import stopwords
from nltk.stem import WordNetLemmatizer, PorterStemmer
from string import punctuation
import re
```

```
[13]: # Expand the default stopwords list if necessary
# YOUR CODE HERE!
```

```
[14]: # Complete the tokenizer function
def tokenizer(text):
    """Tokenizes text."""
```

```

# Create a list of the words
# Convert the words to lowercase
# Remove the punctuation
# Remove the stop words
# Lemmatize words into root words

return tokens

```

```

[15]: # Create a new tokens column for bitcoin
# YOUR CODE HERE!

```

	Compound	Negative	Neutral	Positive	text	tokens
0	0.0516	0.900	0.036	0.064	Cryptocurrency exchange Binance has resumed tr...	[Cryptocurrency, exchange, Binance, resumed, t...
1	0.3818	0.943	0.000	0.057	Bitcoin is now trading at around \$8,130, up a ...	[Bitcoin, trading, around, 8,130, whopping, 60...
2	-0.2263	0.888	0.065	0.047	Binance has vowed to raise the quality of its ...	[Binance, vowed, raise, quality, security, aft...
3	0.3612	0.937	0.000	0.063	A new payment network called Flexa is launchin...	[new, payment, network, called, Flexa, launchi...
4	-0.6486	0.897	0.103	0.000	If you thought that the theft of 7,000 bitcoin...	[thought, theft, 7,000, bitcoins, one, world, ...

```

[16]: # Create a new tokens column for ethereum
# YOUR CODE HERE!

```

	Compound	Negative	Neutral	Positive	text	tokens
0	-0.3919	0.801	0.140	0.059	President Trump tweeted insults at Twitter aga...	[President, Trump, tweeted, insult, Twitter, m...
1	0.1779	0.961	0.000	0.039	After announcing that they were launching a ma...	[announcing, launching, managed, blockchain, s...
2	0.0000	1.000	0.000	0.000	Captain Kirk and neo-Dadaists. Repugnant marke...	[Captain, Kirk, neo-Dadaists, Repugnant, marke...
3	-0.8020	0.717	0.217	0.066	So long as cryptocurrency exists, so too will ...	[long, cryptocurrency, exists, extraordinaryle...
4	-0.6486	0.897	0.103	0.000	If you thought that the theft of 7,000 bitcoin...	[thought, theft, 7,000, bitcoins, one, world, ...

Ngrams and Frequency Analysis

In this section you will look at the ngrams and word frequency for each coin.

1. Use NLTK to produce the n-grams for N = 2.
2. List the top 10 words for each coin.

```

[17]: from collections import Counter
from nltk import ngrams

```

```

[18]: # Generate the Bitcoin N-grams where N=2
# YOUR CODE HERE!

```

```

[18]: (('40', 'million'), 3),
      (('cryptocurrency', 'exchange'), 2),
      (('exchange', 'Binance'), 2),
      (('crypto', 'asset'), 2),
      (('world', ''), 2),
      (('crypto', 'exchange'), 2),
      (('7,000', 'bitcoins'), 2),
      (('one', 'world'), 2),
      (('price', 'Bitcoin'), 2),
      (('Wall', 'Street'), 2),
      (('Street', 'Market'), 2),
      (('last', 'week'), 2),
      (('char', 'Cryptocurrency'), 2),
      (('Binance', 'resumed'), 1),
      (('resumed', 'trading'), 1),
      (('trading', 'activity'), 1),
      (('activity', 'Users'), 1),
      (('Users', 'cancel'), 1),
      (('cancel', 'open'), 1),
      (('open', 'order'), 1)

```

```

[19]: # Generate the Ethereum N-grams where N=2
# YOUR CODE HERE!

```

```

[19]: (('private', 'key'), 5),
      (('Ethereum', 'ETH'), 3),
      (('blockchain', 'bandit'), 2),
      (('last', 'year'), 2),
      (('weak', 'private'), 2),
      (('Elon', 'Musk'), 2),
      (('worth', 'Ethereum'), 2),
      (('JP', 'Morgan'), 2),
      (('President', 'Trump'), 1),
      (('Trump', 'tweeted'), 1),
      (('tweeted', 'insult'), 1),
      (('insult', 'Twitter'), 1),
      (('Twitter', 'morning'), 1),
      (('morning', 'time'), 1),
      (('time', 'Jack'), 1),
      (('Jack', 'took'), 1),
      (('took', 'conversation'), 1),
      (('conversation', 'platform'), 1),
      (('platform', 'White'), 1),
      (('White', 'House'), 1)

```

```

[20]: # Use the token_count function to generate the top 10 words from each coin
def token_count(tokens, N=10):
    """Returns the top N tokens from the frequency count"""
    return Counter(tokens).most_common(N)

```

```

[21]: # Get the top 10 words for Bitcoin
# YOUR CODE HERE!

```

```

[21]: (('char', 16),
      ('Bitcoin', 8),
      ('', 8),
      ('price', 6),
      ('hacker', 6),
      ('exchange', 5),
      ('Binance', 5),
      ('crypto', 4),
      ('cryptocurrency', 4),
      ('million', 4))

```

```

[22]: # Get the top 10 words for Ethereum
# YOUR CODE HERE!

```

```

[22]: (('char', 19),
      ('Ethereum', 9),
      ('blockchain', 8),
      ('key', 7),
      ('private', 5),
      ('world', 5),
      ('time', 4),
      ('weak', 4),
      ('million', 4),
      ('transaction', 4))

```

Word Clouds

In this section, you will generate word clouds for each coin to summarize the news for each coin

```

[23]: from wordcloud import WordCloud
import matplotlib.pyplot as plt
plt.style.use('seaborn-whitegrid')
import matplotlib as mpl
mpl.rcParams['figure.figsize'] = [20.0, 10.0]

```

```

[25]: # Generate the Bitcoin word cloud
# YOUR CODE HERE!

```

Bitcoin Word Cloud

alleged stablecoin **Tether PERSON** an odd one. According to **New Yorks GPE** attorney general, the entire operation may have ... [+3026 chars] Last **month DATE** , we found out that hackers took down a county government in **California GPE** . Around the same time, a city in **Maine GPE** lost control of all its data. These followed **New York GPE** states capital, **Albany GPE** , admitting that hackers had crippled the city's technology ope... [+4455 chars]"Card readers? We don't need no stinking card readers."

-- **Peter da Silva PERSON** (at **the National Academy of Sciences ORG** , **1965 DATE** , in a particularly vivid fantasy) The price of **Bitcoin BTC ORG** has bottomed or so say the cryptocurrency analysts who predicted the end of the bear market. But, they also warning the recent **Tether ORG** drama could turn **Bitcoin GPE** bearish again over the short term.

If that's true, **Bitcoin GPE** could soon mir... [+4703 chars] The major darknet marketplace known as **the Wall Street Market FAC** have been seized and its alleged operators arrested in a joint operation between **European NORP** and **U.S. GPE** authorities. **Millions CARDINAL** in cash, cryptocurrency, and other assets were collected, and the markets sh... [+7334 chars] In its decade-long history, the value of the pioneering cryptocurrency has actually followed a pretty reliable trajectory. That is to say, over the full term **Bitcoin GPE** 's value has only grown, much like many stocks, real estate and precious metals. It has seen d... [+1721 chars]

```
[33]: # List all Entities
# YOUR CODE HERE!

Binance PERSON
Binance GPE
around $8,130 MONEY
60.84 percent PERCENT
the past month DATE
3,086.14 MONEY
the latter half of 2017 DATE
$40 million MONEY
Bitcoin GPE
Flexa ORG
today DATE
GameStop ORG
Nordstrom NORP
7,000 CARDINAL
Bitcoin GPE
Thursday DATE
Bitcoin GPE
6,000 MONEY
first ORDINAL
November last year DATE
$15 million MONEY
Europol PERSON
three CARDINAL
second ORDINAL
more than $550,000 MONEY
around $615,000 MONEY
last week DATE
'm PERSON
May 7 DATE
about 10,000 CARDINAL
Baltimore GPE
RobbinHood ORG
13 CARDINAL
76,280 MONEY
today DATE
102,310 MONEY
Binance PERSON
last week's DATE
7,000 CARDINAL
roughly $40 million MONEY
Monday DATE
Binance GPE
one CARDINAL
around $40 million MONEY
Bloomberg PERSON
Tether PERSON
New Yorks GPE
month DATE
California GPE
Maine GPE
New York GPE
Albany GPE
Peter da Silva PERSON
the National Academy of Sciences ORG
1965 DATE
Bitcoin BTC ORG
Tether ORG
Bitcoin GPE
Bitcoin GPE
the Wall Street Market FAC
European NORP
U.S. GPE
Millions CARDINAL
Bitcoin GPE
```

Ethereum NER

```
[34]: # Concatenate all of the bitcoin text together
# YOUR CODE HERE!

[34]: 'President Trump tweeted insults at Twitter again this morning, but this time Jack took the conversation off platform to the White House. In other news, a controversial Census question creates some strange beffellows, and a "blockchain bandit" is pilfering mil... [+1705 chars] After announcing that they were launching a managed blockchain service late last year, Amazon Web Services is now opening that service up for general availability.\r\nIt was only about five months ago that AWS chief executive Andy Jassy announced that the compa... [+1220 chars] Captain Kirk and neo-Dadaists. Repugnant markets and legendary cryptographers. "Digital cature" auctioned by CryptoKitties developers. Distributed autonomous art organizations. A keynote speech looking back from 2047 at the near-apocalypse of 2026, from whic... [+5265 chars] So long as cryptocurrency exists, so too will the extraordinary lengths to which thieves will go to try to steal it. Unfortunately, that also includes preying on weak private keys, a method that has evidently made one crypto bandit filthy rich with millions in... [+2703 chars] If you thought that the theft of 7,000 bitcoins from one of the world's biggest crypto exchanges would stop Bitcoin's price in its tracks, you were wrong.\r\nThursday, the price of Bitcoin went above $6,000 for the first time since November 1st of this year. At th... [+1729 chars] A) it's a commodity, not a stock\r\nB) nodes don't necessarily mean wallets with Ether in them
C) the venn diagram of the whales and unpatched nodes is probably pretty empty\r\nEthereums creators wanted to create a platform that would allow users all over the world to write decentralized applications, and use the Ethereum ETH blockchain as what it calls a world computer.
Ethereum made smart contracts a common part of the blockchain... [+6602 chars] Elon Musk has been trolling the Ethereum ETH cryptocurrency and its co-founder Vitalik Buterin on Twitter.\r\nThe Tesla founder simply tweeted the word Ethereum early this morning, but shortly later took it back (hehe).\r\nElon Musk (@elonmusk) April 30, 2018. [+1439 chars] Have you been itching to make your first cryptocurrency investment, but you're too afraid to get in on the hype at the wrong time? There's got your back. The social trading platform is giving away free Ethereum to anyone who opens an account in... [+1149 chars] With the SEC recently releasing its long-awaited guidance on Crypto token issuers, it's becoming clear that the crypto world is edging closer to the traditional financial world. New players are joining the sector who hail from traditional finance and trading ... [+4368 chars] Samsung is reportedly looking to develop its own proprietary blockchain network as well as its own token some time in the future.\r\nAccording to an exclusive CoinDesk Korea report, which cited a person familiar with Samsung's internal situation, the South Korean firm is looking to sign and prove ownership of transaction data. Popular blockchains have hundreds of millions of transactions which include some of the most popular... [+24770 chars] The open source project, called Ion, deals with the underlying mechanics of how networks talk to each other. For example, if you log onto Airbnb using Facebook, a protocol deals with the software that sends the personal information from your social profile to... [+877 chars] Opera will soon be adding native support for the TRON blockchain in its cryptocurrency-focused browser.\r\nAmong other things, the new integration will make it possible to natively use TRON-powered dapps and tokens within the browser. Opera will also add support... [+2177 chars] Someone is stealing millions of dollars worth of Ethereum by guessing users' private keys. Normally this should be impossible, but there are lots of keys set to be very weak. Researchers are unsure how those weak keys are being generated and used.\r\nTheir paper is here... [+147 chars] JP Morgan and Microsoft have formed a strategic partnership to promote the adoption of enterprise blockchain, reports Jane Connolly.\r\nDeveloped by JP Morgan, Quorum is an enterprise-variant of the Ethereum blockchain. It will be the first distributed ledger platform. [+1232 chars] If you were on the internet in the late 1990s, you might remember companies like AllAdvantage that promised to pay you to surf the web. You could install a program that tracked your browsing and showed you targeted ads at the top of the screen; then AllAdvant... [+5038 chars]'
```

```
[35]: # Run the NER processor on all of the text
# YOUR CODE HERE!

# Add a title to the document
# YOUR CODE HERE!

[36]: # Render the visualization
# YOUR CODE HERE!
```

Ethereum NER
President **Trump PERSON** tweeted insults at **Twitter GPE** again **this morning TIME** , but this time **Jack PERSON** took the conversation off platform to **the White House ORG** . In other news, a controversial Census question creates some strange beffellows, and a "blockchain bandit" is pilfering mil... [+1705 chars] After announcing that they were launching a managed blockchain service **late last year DATE** , **Amazon Web Services ORG** is now opening that service up for general availability. It was **only about five months ago DATE** that AWS chief executive **Andy Jassy PERSON** announced that the compa... [+1220 chars] **Captain Kirk PERSON** and **neo-Dadaists NORP** . Repugnant markets and legendary cryptographers. " **Digital ORG** cature" auctioned by **CryptoKitties ORG** developers. Distributed autonomous art organizations. A keynote speech looking back from **2047 DATE** at the near-apocalypse of **2026 DATE** , from whic... [+5265 chars] So long as cryptocurrency exists, so too will the extraordinary lengths to which thieves will go to try to steal it. Unfortunately, that also includes preying on weak private keys, a method that has evidently made **one CARDINAL** crypto bandit filthy rich with **millions CARDINAL** in... [+2703 chars] If you thought that the theft of **7,000 CARDINAL** bitcoins from one of the world's biggest crypto exchanges would stop **Bitcoin GPE** 's price in its tracks, you were wrong. On **Thursday DATE** , the price of **Bitcoin GPE** went above \$ **6,000 MONEY** for the **first ORDINAL** time since **November last year DATE** . At th... [+1729 chars] A) it's a commodity, not a stock B) nodes don't necessarily mean wallets with **Ether PERSON** in them C) the venn diagram of the whales and unpatched nodes is probably pretty empty\r\nEthereums creators wanted to create a platform that would allow users all over the world to write decentralized applications, and use the Ethereum **ETH ORG** blockchain as what it calls a world computer. Ethereum made smart contracts a common part of the blockchain... [+6602 chars] Elon Musk has been trolling the Ethereum **ETH ORG** cryptocurrency and its co-founder **Vitalik Buterin PERSON** on **Twitter GPE** . The Tesla founder simply tweeted the word **Ethereum GPE** **early this morning TIME** , but shortly later took it back (hehe).
jk
Elon Musk (@elonmusk) **April 30, 2018**. [+1439 chars] Have you been itching to make your **first ORDINAL** cryptocurrency investment, but you're too afraid to get in on the hype at the wrong time? There's got your back. The social

... [1149 chars] SEC ORG recently releasing its long-awaited guidance on Crypto token issuers, it's becoming clear that the crypto world is edging closer to the traditional financial world. New players are joining the sector who hail from traditional finance and trading ... [4368 chars] Samsung is reportedly looking to develop its own proprietary blockchain network as well as its own token some time in the future.

According to an exclusive CoinDesk Korea GPE report, which cited a person familiar with Samsungs internal situation, the South Kore... [2496 chars] There's a blockchain bandit on the loose and they've already thieved over \$6.1 million MONEY worth of Ethereum GPE .

According to a report published by security consulting firm Independent Security Evaluators ORG (ISE ORG), an unknown entity has been bypassing weak private keys ... [2797 chars] Ethereum ETH ORG whales account for just 7 percent PERCENT of transaction activity in the market but they control a third CARDINAL of the cryptocurrencies entire circulating supply.

That's according to a new study by Chainalysis GPE which found that although these whales dont have a... [3193 chars] Cisco CVE-2019-1804 PERSON Some switches in Cisco GPE 's 9000 PRODUCT series are susceptible to a remote vulnerability. It's a bit odd to call it a vulnerability, actually, because the software is operating as intended. Cisco PERSON shipped out these switches with the same private key ... [5280 chars] Abstract:

Blockchains are public ledgers of transactions verified through the use of public and private keys to sign and prove ownership of transaction data. Popular blockchains have hundreds of millions CARDINAL of transactions which include some of the most popular... [24770 chars] The open source project, called Ion ORG , deals with the underlying mechanics of how networks talk to each other. For example, if you log onto Airbnb PERSON using Facebook PERSON , a protocol deals with the software that sends the personal information from your social profile to... [877 chars] Opera will soon be adding native support for the TRON ORG blockchain in its cryptocurrency-focused browser.

Among other things, the new integration will make it possible to natively use TRON ORG -powered dapps and tokens within the browser. Opera ORG will also add suppor... [2177 chars] Someone is stealing millions of dollars MONEY worth of Ethereum GPE by guessing users' private keys. Normally this should be impossible, but lots of keys seem to be very weak. Researchers are unsure how those weak keys are being generated and used.

Their paper is here... [147 chars] JP Morgan PERSON and Microsoft ORG have formed a strategic partnership to promote the adoption of enterprise blockchain, reports Jane Connolly PERSON .

Developed by JP Morgan, Quorum PERSON an enterprise-variant of the Ethereum GPE blockchain will be the first ORDINAL distributed ledger platfo... [1232 chars] If you were on the internet in the late 1990s DATE , you might remember companies like AllAdvantage ORG that promised to pay you to surf the web. You could install a program that tracked your browsing and showed you targeted ads at the top of the screen; then AllAdvant PERSON ... [5038 chars]

```
[37]: # List all Entities
# YOUR CODE HERE!
```

```

Trump PERSON
Twitter GPE
this morning TIME
Jack PERSON
the White House ORG
late last year DATE
Amazon Web Services ORG
only about five months ago DATE
Andy Jassy PERSON
Kirk PERSON
neo-Dadaists NORP
Digital ORG
CryptoKitties ORG
2047 DATE
2026 DATE
one CARDINAL
millions CARDINAL
7,000 CARDINAL
Bitcoin GPE
Thursday DATE
Bitcoin GPE
6,000 MONEY
first ORDINAL
November last year DATE
Ether PERSON
ETH ORG
ETH ORG
Vitalik Buterin PERSON
Twitter GPE
Ethereum GPE
early this morning TIME
April 30 DATE
201 CARDINAL
chars)Have PERSON
first ORDINAL
SEC ORG
CoinDesk Korea GPE
over $6.1 million MONEY
Ethereum GPE
Independent Security Evaluators ORG
ISE ORG
ETH ORG
just 7 percent PERCENT
a third CARDINAL
Chainalysis GPE
chars)Cisco CVE-2019-1804 PERSON
Cisco GPE
9000 PRODUCT
Cisco PERSON
hundreds of millions CARDINAL
Ion ORG
Airbnb PERSON
Facebook PERSON
TRON ORG
TRON ORG
Opera ORG
millions of dollars MONEY
Ethereum GPE
Morgan PERSON
Microsoft ORG
Jane Connolly PERSON
Quorum PERSON
Ethereum GPE
first ORDINAL
the late 1990s DATE
AllAdvantage ORG
AllAdvant PERSON
  
```