# **Real-Time** News Sentiment **Analysis Pipeline**



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# Objective



With all the negativity in news headlines recently, it can be a real strain on mental health when you are constantly bombarded with negative news articles and headlines. This project was intended to assist, when you just need a break from negative news articles and want to filter news by positive, neutral or negative sentiment. This was the problem I wanted to create a solution for and by developing a pipeline that performs real-time sentiment analysis on news articles and allows for the user to filter results based on positive or negative sentiment of each article.





# Tools

### Ehe New Hork Eimes Developers







# What is Sentiment Analysis?

"Sentiment Analysis is a computational process to determine the overall sentiment of a piece of text. This sentiment is usually categorized into 3 main output's, Positive, Neutral and Negative. This process can help determine the "mood" of the text and this can be extremely useful in a variety of use cases."





### Data

### **Ehe New York Eimes**



#### \*Data is returned as a Json object



{C Developers

Times Newswire API

#### **Times Newswire API**

With the Times Newswire API, you can get links and metadata for Times' articles as soon as they are published on NYTimes.com. The Times Newswire API provides an up-to-theminute stream of published articles. You can filter results by source (all, nyt, inyt) and section (arts, business, ...).

/content/{source}/{section}.json

Example Calls

https://api.nytimes.com/wc/news/v3/content/all/all.json?api-key=yourkey https://api.nytimes.com/svc/news/v3/content/nyt/business.json?api-key=yourkey https://spi.nytimes.com/svc/news/v3/content/nyc/world.json?api-key=yourkey

The section-list endpoint returns a list of sections.

/content/section-list

#### Example Call

https://api.nytimes.com/svc/news/v3/content/section-list.json?api-key=yourkey

Tiger Woods Announces He Had Fifth Back Operation	Sports	19tiger	BY ELENA	Article	News	['Golf']	['PGA Tour Inc']	['Woods,	null	Woods, 45, has had five	2021-01-	https://www.
			BERGERON					Tiger']		operations on his spine in the past	19	nytimes.com/
										seven years. He expects to miss	22:15:24	2021/01/19/s
										the first two months of the PGA	UTC	ports/golf/tige
										Tour.		r-woods-back-
												surgery.html



#### Cloud Scheduler is used to schedule the pipeline execution via a cronjob and using HTTP App Engine to run a Cloud Function which will execute a python script hosted on a VM Compute Engine and will log the function run data. The script returns news headlines data from the real-time Timeswire API. Next the script processes the data and utilizes VADER Sentiment analysis to analyze the title and abstract columns. Creates a aggregated sentiment score for each article. Then the data is stored as a CSV file and uploaded to a GCP Cloud Storage Bucket and also the data is loaded into a BigQuery table. Finally the BigQuery table is accessed by the DataStudio dashboard and data is refreshed every few minutes, for a real-time sentiment analysis dashboard.



### Sentiment Results

	title	section	slug_name	byline	item_type	material_type_facet	des_facet	01	rg_facet	per_facet	geo_facet					
0	Deepening Schism, McConnell Says Trump 'Provok	U.S.	19dc-impeach	BY NICHOLAS FANDOS	Article	News	[United States Politics and Government, Stormi	[Senate, Rep	publican Party]	[McConnell, Mitch, Trump, Donald J]	None					
1	NASA's Decision for Moon Rocket: Test Again or	Science	19nasa	BY KENNETH CHANG	Article	News	[Rocket Science and Propulsion, United States	[] Aeronau Admini:	National itics and Space stration]	[Bridenstine, James F (1975- )]	None					
2	Biden's Peloton bike could present cybersecuri	U.S.	19transition- briefing-biden- peloton	BY SHERYL GAY STOLBERG	Article	Live Blog Post	None		None	None	None					
3	Biden to Announce Broad Plan to Reverse Trump	U.S.	19dc-immig	BY MICHAEL D. SHEAR	Article	News	[Illegal Immigration, Immigration and Emigrati		None	[Biden, Joseph R Jr, Trump, Donald J]	None					
4	Parler Tries to Survive With Help From Russian	Technology	19parler	BY JACK NICAS	Article	News	[Right-Wing Extremism and Alt- Right, Computers	[Amazon.c Pa	com Inc, rler LLC]	[Matze, John, Trump, Donald J]	None					
						-	compound_title	neg_title	neu_title	pos_title	compound_a	b neg_ab	neu_ab	pos_ab	sentiment_score	sentiment
							0.0000	0.000	1.000	0.000	0.202	3 0.062	0.850	0.088	0.2023	Positive
					_		0.0000	0.000	1.000	0.000	0.202	3 0.095	0.773	0.132	0.2023	Positive
V	ADER S	entim	nent Ar	nalysi	s Res	sults	-0.2732	0.174	0.826	0.000	0.000	0 0.000	0.000	0.000	-0.2732	Negative
							0.0000	0.000	1.000	0.000	0.670	5 0.000	0.800	0.200	0.6705	Positive
							0.4019	0.000	0.748	0.252	0.636	9 0.065	0.690	0.246	1.0388	Positive

·...

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## **Real-Time Sentiment Dashboard**

Positive Neutral

#### N.Y. Times Real-Time News Sentiment Section Sentiment Neutral Negative Positive U.S. Sports World Science Opinion Arts Cross. Food Real Estate Health Magaz. Busine. Home Page 0 5 10 15 20 25

section

1.11

0.82

0.82

0.73

0.6

0.45

0.48

0.44

0.4

1-19/19

Sports

Sports

Opinion

Opinion

Real Est...

Food

#### Most Positive News

Could Mitch McConnell Get to Yes?

A Ray of Hope in a Slimy Southern Cave

Recipes to Cook Over a Long Weekend

Bradie Tennell Wins Her Second U.S. Figure Skating Title

With Positive Tests, the Rules Change for Some Players in...

Sylvain Sylvain of the Proto-Punk Band New York Dolls Die... Arts

Aaron Rodgers threw a beautiful 58-vard touchdown pass ... Sports

Sonia Sotomayor will swear in Kamala Harris on Inaugurat... U.S.

Who is Mike Lindell, one of Trump's last remaining suppor... U.S.

The Noise Upstairs Is Unbearable. How Do I Stop It?

title

10

*Click Here
For Live
Dashboard*



Negative



#### Material Type Sentiment

1-30/30



### **Conclusion & Next Steps**

### Conclusion:

In conclusion the project was successful and I was able to make use of the real-time news sentiment analysis and although the model does work fairly well, I am looking forward to improving the sentiment analysis results.

### Next Steps:

- The next steps for this project would be to create a Streamlit app to be able to access the article's and for a more user friendly application.
- Improving the Sentiment model using Google Natural Language Processing API

