



Big Data

Spark for streaming data

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S³Lab

Smart Software System Laboratory



“Big data is at the foundation of all the megatrends that are happening today, from social to mobile to cloud to gaming.”

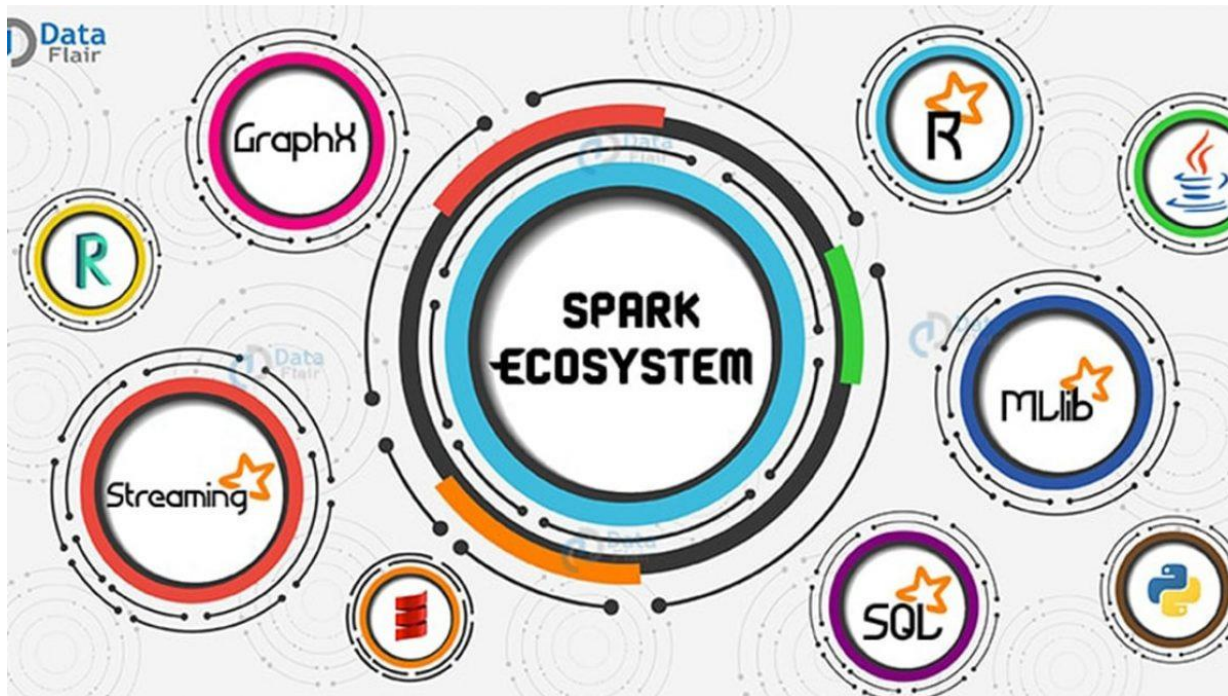
– Chris Lynch, Vertica Systems

Spark Structure Streaming



Streaming in Spark

Spark Streaming vs Structure Streaming



Streaming in Spark

Spark Streaming vs Structure Streaming

Spark



```
from pyspark.sql import streaming
```

SQL Structured Streaming

versus



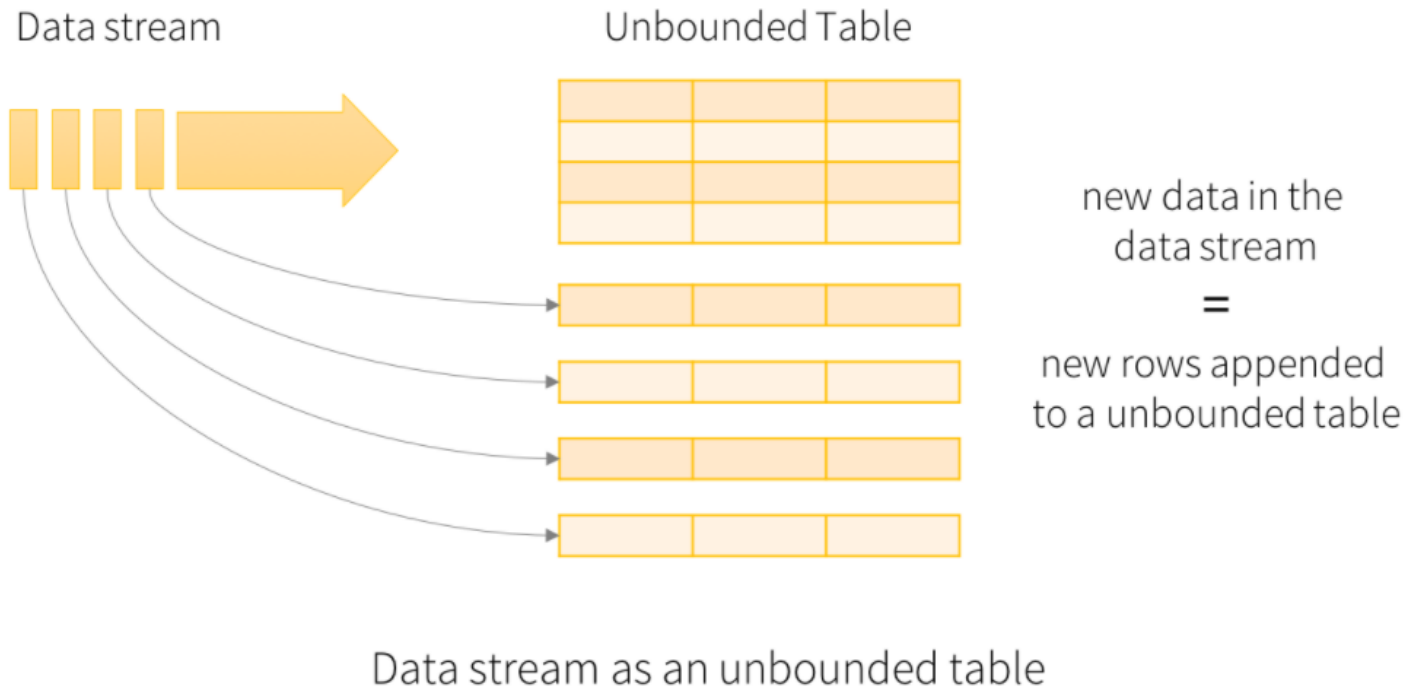
```
from pyspark import streaming
```

Streaming Component

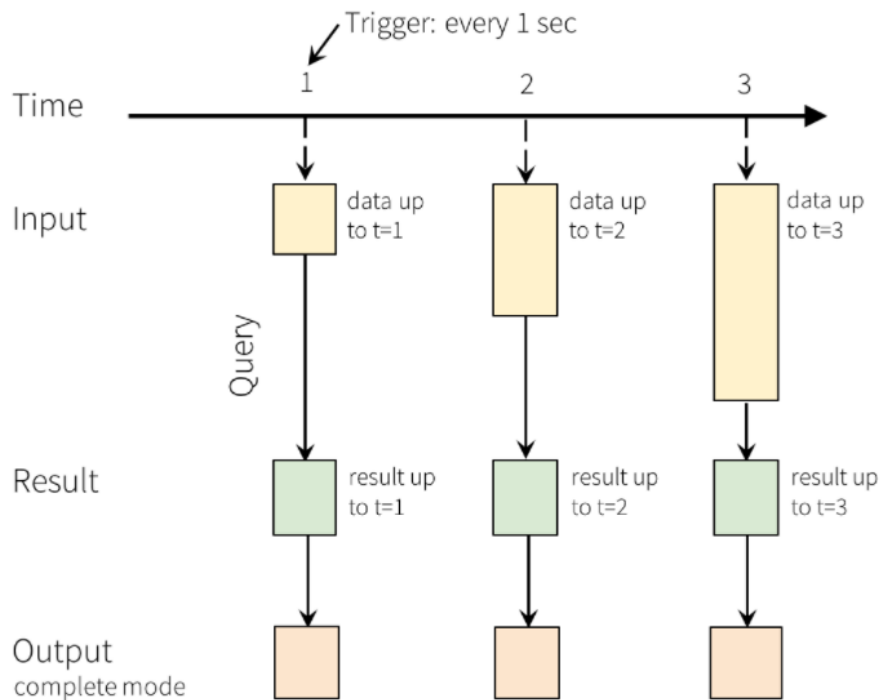
And remember,

Spark SQL Structured Streaming \neq Spark Streaming (module)

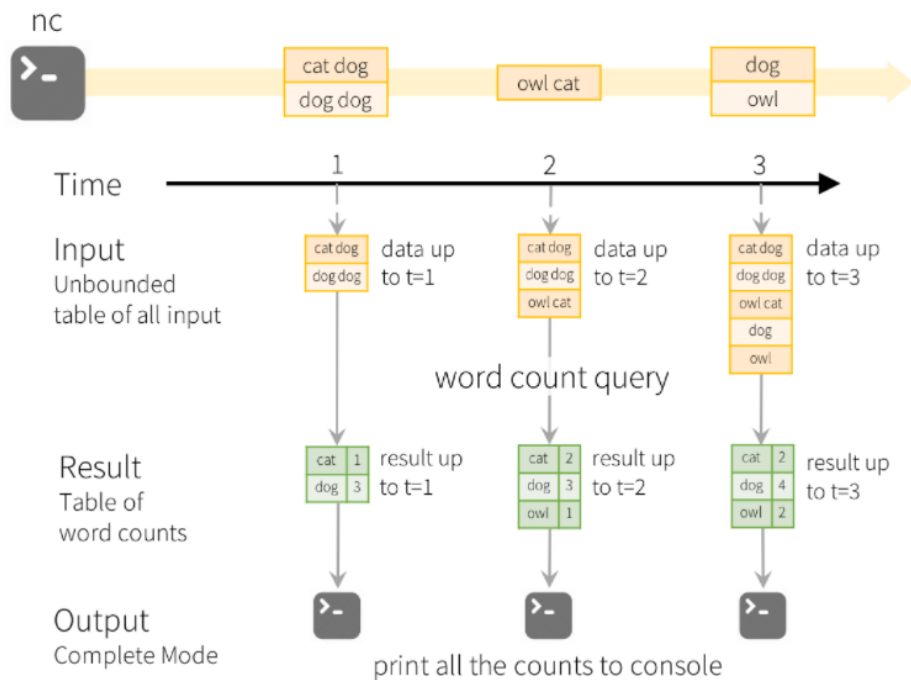
Streaming in Spark



Streaming in Spark



Streaming in Spark



Streaming in Spark

Input Source

- File source
- Kafka source
- Socket source (for testing)
- Rate source (for testing)

Streaming in Spark

Output Sinks

- File sink
- Kafka sink
- Memory sink
- Console sink (for debugging)
- Foreach sink

Streaming in Spark

<https://spark.apache.org/docs/latest/structured-streaming-programming-guide.html>

Structure streaming

Quick example

```
import findspark
findspark.init()
import pyspark
from IPython.display import display, clear_output
from pyspark.sql import SparkSession
from pyspark.sql import functions as f
import pandas as pd
```

```
from pyspark.sql import SparkSession
from pyspark.sql.functions import explode
from pyspark.sql.functions import split

spark = SparkSession \
    .builder \
    .appName("StructuredNetworkWordCount") \
    .getOrCreate()
```

Structure streaming

Quick example

```
# Create DataFrame representing the stream of input lines from connection to localhost:9999
lines = spark \
    .readStream \
    .format("socket") \
    .option("host", "localhost") \
    .option("port", 9999) \
    .load()

# Split the lines into words
words = lines.select(
    explode(
        split(lines.value, " ")
    ).alias("word")
)

# Generate running word count
wordCounts = words.groupBy("word").count()
```

Structure streaming

Quick example – Console sink

```
# Start running the query that prints the running counts to the console  
query = wordCounts \  
    .writeStream \  
    .outputMode("complete") \  
    .format("console") \  
    .start()  
  
query.awaitTermination()
```

Run netcat and Spark application

Quick example – Console sink

```
D:\Spark\nc112>nc -l -p 9999
cacat
dog
cat dog fish
dog fish rat
```

```
D:\Spark\spark-3.0.1-bin-hadoop2.7>spark-submit code/quickexample.py
```

```
Batch: 3
```

```
-----+-----+
| word|count|
+-----+-----+
|  rat|    1|
|  dog|    4|
|  cat|    1|
|cacat|    1|
| fish|    2|
+-----+-----+
```



Structure streaming

Quick example – Memory sink

```
# Start running the query that write the running counts to memory  
query = wordCounts \  
    .writeStream \  
    .queryName("wordCounts") \  
    .outputMode("complete") \  
    .format("memory") \  
    .start()
```

Structure streaming

Quick example – Memory sink

 Command Prompt - nc -l -p 9999

```
D:\Spark\nc111nt>nc -l -p 9999
dog cat fish
dog cat
```

```
display(spark.sql(f"SELECT * from {query.name}").show())
```

```
+-----+
|word|count|
+-----+
| dog|    1|
| cat|    1|
|fish|    1|
+-----+
```

Structure streaming

Quick example – Memory sink

```
Command Prompt - nc -l -p 9999
D:\Spark\nc111nt>nc -l -p 9999
dog cat fish
dog cat
dog cat cat
cat cat fish
chicken
```

```
[7]: display(spark.sql(f"SELECT * from {query.name}").show())
```

```
+-----+
|word|count|
+-----+
| dog|    1|
| cat|    1|
| fish|   1|
+-----+
```

None

```
[*]: # show live results for 2 minutes, refreshed every 1 second
from time import sleep
for x in range(0, 120):
    # spark.sql can be used to request how the query is performing
    display(spark.sql(f"SELECT * from {query.name}").toPandas())
    sleep(1)
    clear_output(wait=True)
else:
    print("Live view ended...")
```

	word	count
0	dog	3
1	cat	6
2	chicken	1
3	fish	2

Structure streaming

Streaming from files

```
import pyspark
from IPython.display import display, clear_output
from pyspark.sql import SparkSession, DataFrame
from pyspark.sql import functions as f
import pandas as pd
from pyspark.ml import PipelineModel
from pyspark.sql.functions import udf
from pyspark.sql.streaming import DataStreamReader
import html

# SETTINGS
IN_PATH = "/kaggle/input/twitter-data-for-spark-streaming/"

timestampformat = "EEE MMM dd HH:mm:ss zzzz yyyy"
spark.sql("set spark.sql.legacy.timeParserPolicy=LEGACY")
spark = SparkSession.builder.appName("StructuredStreamingExample").getOrCreate()
spark.conf.set("spark.sql.legacy.timeParserPolicy", "LEGACY")
schema = spark.read.json(IN_PATH).limit(10).schema

spark_reader = spark.readStream.schema(schema)
```

Structure streaming

Streaming from files

```
streaming_data_raw = (  
    spark_reader.json(IN_PATH)  
    .select(  
        "id",  
        # extract proper timestamp from created_at column  
        f.to_timestamp(f.col("created_at"), timestampformat).alias("timestamp"),  
        # extract user information  
        f.col("user.screen_name").alias("user"),  
        "text",  
    )  
    .coalesce(1)  
)  
streaming_data_clean = clean_data(streaming_data_raw)  
  
stream_writer = (streaming_data_clean.writeStream.queryName("data").trigger(once=True).outputMode("append").format("memory"))  
  
query = stream_writer.start()
```

Structure streaming

Streaming from files

```
display(spark.sql(f"SELECT * from {query.name}").show())
```

id	timestamp	user	text	original_text
1250972456673857538	2020-04-17 02:20:50	dibeckss	RT me after check...	RT @itsxdianaa: m...
1250972454035611649	2020-04-17 02:20:49	meanmediumode2	RT I love intra p...	RT @theroguecreat...
1250972456736526336	2020-04-17 02:20:50	mathoeee	RT won t say i m ...	RT @ArianaGrande:...
1250972455625125888	2020-04-17 02:20:50	Atalarania00	RT won t say i m ...	RT @ArianaGrande:...
1250972455834812416	2020-04-17 02:20:50	kaluvvbot	RT y all really o...	RT @solsticemark:...
1250972455457312768	2020-04-17 02:20:49	_larrri	RT Happy Birthday...	RT @btsinluv777: ...
1250972453670547457	2020-04-17 02:20:49	twiliight_omen	Sorry but I won't...	Sorry, but I won'...
1250972453440028674	2020-04-17 02:20:49	HooverAthletics	RT Thank you for ...	RT @mj_thomas10: ...
1250972456061480960	2020-04-17 02:20:50	WaterBottle199	RT God Bless Amer...	RT @jakecoco: God...
1250972453582573572	2020-04-17 02:20:49	tj02008	RT MS ARIANA GRAN...	RT @francisdomini...
1250972453695676417	2020-04-17 02:20:49	nidzjordan	RT Today together...	RT @ADNFOREVER167...
1250972456493309958	2020-04-17 02:20:50	emmaaa_blythe	RT Love my Instan...	RT @atdanwhite: L...
1250972456292155392	2020-04-17 02:20:50	cloutchaserprt	RT Imma go take a...	RT @RandomPocket1...
1250972454777786368	2020-04-17 02:20:49	cakesiroe	RT True love's kiss	RT @Pillow_boi: T...
1250972454823948288	2020-04-17 02:20:49	kthnsbno	RT Full video cov...	RT @ArianaToday: ...
1250972454261977089	2020-04-17 02:20:49	sunshciner	RT You're smile m...	RT @_jenible: "Yo...
1250972455759462402	2020-04-17 02:20:50	sincerelyyoolie	I just love when ...	I just love when ...
1250972453398097920	2020-04-17 02:20:49	yjunlionness	RT Well does that...	RT @crackheadtxt...
1250972456858329088	2020-04-17 02:20:50	KballeroandanT	RT Dear we love y...	RT @That_Radish_t...
1250972455008493568	2020-04-17 02:20:49	KhitLm1	RT No amount can ...	RT @MingErs_Intl:...

Structure streaming

Streaming from files

```
distinct_user_count = streaming_data_clean.select(f.approx_count_distinct("user"), f.current_timestamp())

stream_writer = (distinct_user_count.writeStream.queryName("data").trigger(once=True).outputMode("complete").format("memory"))

query = stream_writer.start()
```

+ Code

+ Markdown

```
display(spark.sql(f"SELECT * from {query.name}").show())
```

```
+-----+-----+
|approx_count_distinct(user)| current_timestamp()|
+-----+-----+
|49|2021-06-20 02:47:...|
+-----+-----+
```


Structure streaming

Streaming from files

```
sentiment_model = PipelineModel.load("/kaggle/input/pyspark-nlp/MODEL")
raw_sentiment = sentiment_model.transform(streaming_data_clean)

# Select downstream columns
sentiment = raw_sentiment.select(
    "id", "timestamp", "user", "text", f.col("prediction").alias("user_sentiment")
)
```

```
stream_writer = (sentiment.writeStream.queryName("data").trigger(once=True).outputMode("append").format("memory"))

query = stream_writer.start()
```

Structure streaming

Streaming from files

```
display(spark.sql(f"SELECT * from {query.name}").show())
```

id	timestamp	user	text	user_sentiment
1250972456673857538	2020-04-17 02:20:50	dibeckss	RT me after check...	4.0
1250972454035611649	2020-04-17 02:20:49	meanmediumode2	RT I love intra p...	4.0
1250972456736526336	2020-04-17 02:20:50	mathoeeee	RT won t say i m ...	4.0
1250972455625125888	2020-04-17 02:20:50	Atalarania00	RT won t say i m ...	4.0
1250972455834812416	2020-04-17 02:20:50	kaluvbot	RT y all really o...	4.0
1250972455457312768	2020-04-17 02:20:49	_larrri	RT Happy Birthday...	4.0
1250972453670547457	2020-04-17 02:20:49	twililight_omen	Sorry but I won't...	0.0
1250972453440028674	2020-04-17 02:20:49	HooverAthletics	RT Thank you for ...	4.0
1250972456061480960	2020-04-17 02:20:50	WaterBottle199	RT God Bless Amer...	4.0
1250972453582573572	2020-04-17 02:20:49	tj02008	RT MS ARIANA GRAN...	4.0
1250972453695676417	2020-04-17 02:20:49	nidzjordan	RT Today together...	4.0
1250972456493309958	2020-04-17 02:20:50	emmaaa_blythe	RT Love my Instan...	4.0
1250972456292155392	2020-04-17 02:20:50	cloutchaserprt	RT Imma go take a...	0.0
125097245477786368	2020-04-17 02:20:49	cakesiroe	RT True love's kiss	4.0
1250972454823948288	2020-04-17 02:20:49	kthnsbno	RT Full video cov...	4.0
1250972454261977089	2020-04-17 02:20:49	sunshciner	RT You're smile m...	4.0
1250972455759462402	2020-04-17 02:20:50	sincerelyyoolie	I just love when ...	4.0
1250972453398097920	2020-04-17 02:20:49	yjunlionness	RT Well does that...	4.0
1250972456858329088	2020-04-17 02:20:50	Kballeroandant	RT Dear we love y...	4.0
1250972455008493568	2020-04-17 02:20:49	KhitLm1	RT No amount can ...	4.0

only showing top 20 rows

Structure streaming

Streaming from files

```
negative_sentiment_count = (  
    sentiment.filter("user_sentiment == 0.0")  
    .select(f.col("user_sentiment").alias("negative_sentiment"))  
    .agg(f.count("negative_sentiment"))  
)  
  
positive_sentiment_count = (  
    sentiment.filter("user_sentiment == 4.0")  
    .select(f.col("user_sentiment").alias("positive_sentiment"))  
    .agg(f.count("positive_sentiment"))  
)  
  
average_sentiment = sentiment.agg(f.avg("user_sentiment"))
```

```
data_to_stream = average_sentiment
```

Structure streaming

Streaming from files

```
if isinstance(spark_reader, DataStreamReader):
    stream_writer = (
        data_to_stream.writeStream.queryName("streaming_table")
        .trigger(processingTime="20 seconds")
        #.trigger(once=True)
        .outputMode("complete")
        .format("memory")
    )
    # Calling .start on a DataStreamWriter return an instance of StreamingQuery
    query = stream_writer.start()
```

```
display(spark.sql(f"SELECT * from {query.name}").show())
```

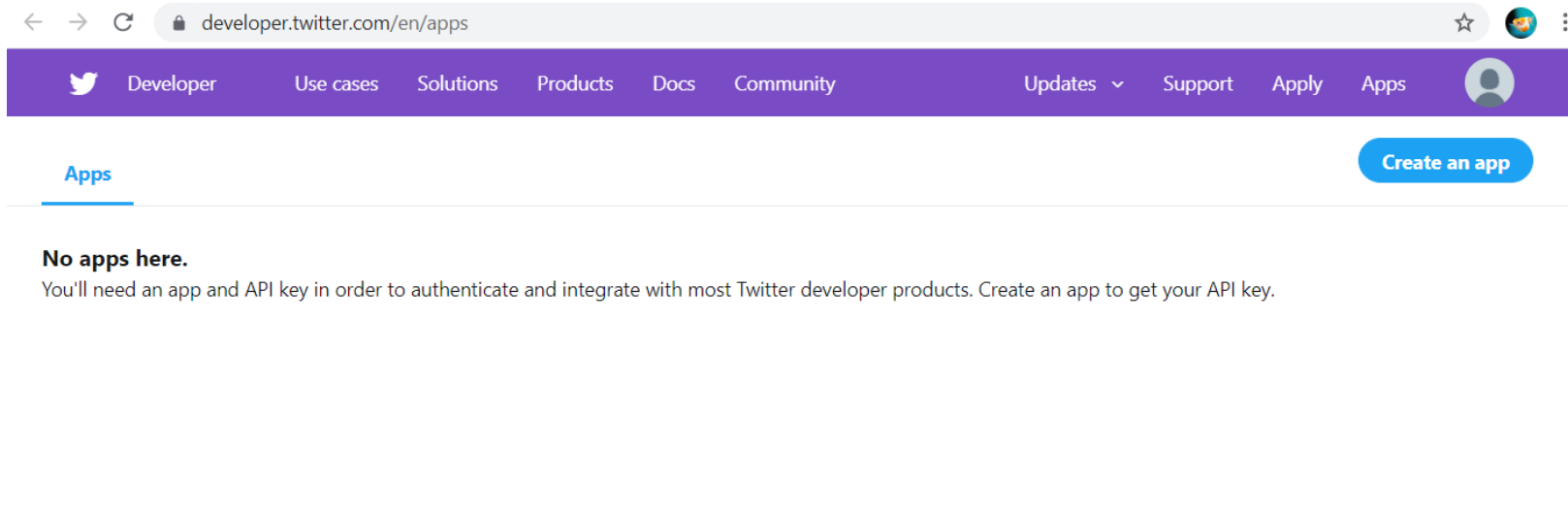
```
+-----+
|avg(user_sentiment)|
+-----+
|                3.68|
+-----+
```

Structure streaming

Streaming from files

```
# Let's see what we are outputting
if streaming_data_clean.isStreaming:
    from time import sleep
    for x in range(0, 200):
        try:
            if not query.isActive:
                break
            print("Showing live view refreshed every 10 seconds")
            print(f"Seconds passed: {x*10}")
            result = spark.sql(f"SELECT * from {query.name}")
            # spark.sql can be used to request how the query is performing
            display(result.toPandas())
            sleep(10)
            clear_output(wait=True)
        except KeyboardInterrupt:
            break
    print("Live view ended...")
else:
    print("Not streaming, showing static output instead")
    result = data_to_stream
    display(result.limit(10).toPandas())
```

Create Twitter App



Create Twitter App



#ApplicationReceived

Your email has been verified and your application is officially under review!

We'll let you know when it's done, or if we need any additional information from you by sending an email

Create Twitter App

The screenshot displays the Twitter Developer Portal interface. On the left is a dark sidebar with the following elements:

- Twitter logo and 'Developer Portal' header.
- Navigation links: Dashboard (house icon), Projects & Apps (people icon), Overview, Project 1.
- A section titled 'TwitterNLPUI' with a blue highlight.
- Links for Products (code icon, marked 'NEW') and Account (gear icon).

The main content area is titled 'Keys and tokens' and contains two sections:

- Consumer Keys**: Includes a card for 'API Key and Secret' with a blue 'Regenerate' button.
- Authentication Tokens**: Includes two cards:
 - Bearer Token**: Shows 'Generated June 20, 2021' and has 'Regenerate' and 'Revoke' buttons.
 - Access Token and Secret**: Shows 'Generated June 20, 2021' and 'For @dotronghop'. It has 'Regenerate' and 'Revoke' buttons, and a note 'Created with Read Only permissions'.

Create Twitter App

```
secrets.py x twitter_app.ipynb
1  """Replace the values below with your own Twitter API Keys, Secrets, and Tokens"""
2
3  # Twitter Consumer API keys
4  CONSUMER_KEY = "0r"          dg"
5  CONSUMER_SECRET = "R7"          4y"
6
7  # Twitter Access token & access token secret
8  ACCESS_TOKEN = "14"          3"
9  ACCESS_SECRET = "Rj"          1Y"
10
11
12  class TwitterSecrets:
13      """Class that holds Twitter Secrets"""
14
15      def __init__(self):
16          self.CONSUMER_KEY = CONSUMER_KEY
17          self.CONSUMER_SECRET = CONSUMER_SECRET
18          self.ACCESS_TOKEN = ACCESS_TOKEN
19          self.ACCESS_SECRET = ACCESS_SECRET
20
21      # Tests if keys are present
22      for key, secret in self.__dict__.items():
23          assert secret != "", f"Please provide a valid secret for: {key}"
24
25
26  twitter_secrets = TwitterSecrets()
27
```

Create Twitter App

```
from secrets import twitter_secrets as ts
```

```
OUT_PATH = "twitterdata"
```

```
QUERY = "euro 2021"
```

```
STOP_AFTER = 500
```

```
import json
```

```
import tempfile
```

```
import requests
```

```
import pathlib
```

```
from datetime import datetime as dt
```

```
from uuid import uuid4
```

```
from requests_oauthlib import OAuth1Session
```

Create Twitter App

```
pathlib.Path(OUT_PATH).mkdir(parents = True, exist_ok = True)

query_data = {
    "track": f"#{QUERY}".replace("#", "").lower(), "language": "en",
}

twitter = OAuth1Session(
    client_key = ts.CONSUMER_KEY,
    client_secret = ts.CONSUMER_SECRET,
    resource_owner_key = ts.ACCESS_TOKEN,
    resource_owner_secret = ts.ACCESS_SECRET,
)

url = "https://stream.twitter.com/1.1/statuses/filter.json"
query_url = f"{url}?{'&'.join([f'{k}={v}' for k, v in query_data.items()])}"

print(f"STREAMING {STOP_AFTER} TWEETS")

with twitter.get(query_url, stream = True) as response:
    for i, raw_tweet in enumerate(response.iter_lines()):
        if i == STOP_AFTER:
            break
        try:
            tweet = json.loads(raw_tweet)
            print(f"{i+1}/{STOP_AFTER}: {tweet['user']['screen_name']} @ {tweet['created_at']}: {tweet['text']}\n")
        except (json.JSONDecodeError, KeyError) as err:
            print("ERROR")
            continue
        with pathlib.Path(OUT_PATH) / f"{dt.now().timestamp()}-{uuid4()}.json" as F:
            F.write_bytes(raw_tweet)
```

Create Twitter App

The screenshot displays a Jupyter Notebook environment. On the left, a file explorer shows a directory named 'twitterdata/' containing a list of files. The files are named with IDs and timestamps, such as '1624206133.7195...' and '10 minutes ago'. On the right, a code editor window titled 'twitter_app.ipynb' shows a stream of tweets. The tweets are displayed in a list, with each tweet starting with a timestamp and a user handle, followed by the tweet text. The tweets include various topics, such as 'Italy v Wales: Euro 2020 - live!', 'Updated Euro 2021 group scenarios', and 'Fantasy Football Scout: The latest EURO 2020 injury updates and team news for Matchday 3'.

Name	Last Modified
1624206133.7195...	10 minutes ago
1624206153.8029...	9 minutes ago
1624206181.7326...	9 minutes ago
1624206199.9098...	8 minutes ago
1624206229.9137...	8 minutes ago
1624206246.5548...	8 minutes ago
1624206246.5981...	8 minutes ago
1624206253.0625...	8 minutes ago
1624206256.5263...	8 minutes ago
1624206260.6857...	7 minutes ago
1624206260.9056...	7 minutes ago
1624206290.5202...	7 minutes ago
1624206309.3876...	7 minutes ago
1624206313.7962...	7 minutes ago
1624206342.8306...	6 minutes ago
1624206357.1366...	6 minutes ago
1624206379.4565...	5 minutes ago
1624206395.7268...	5 minutes ago
1624206407.4405...	5 minutes ago
1624206408.3952...	5 minutes ago
1624206417.5941...	5 minutes ago
1624206422.3052...	5 minutes ago
1624206429.7717...	5 minutes ago

```
STREAMING 500 TWEETS
1/500: press24newslive @ Sun Jun 20 16:22:11 +0000 2021: Italy v Wales: Euro 2020 - live! | Football https://t.co/UTGYAvFdKi

2/500: Anisa_News @ Sun Jun 20 16:22:30 +0000 2021: Updated Euro 2021 group scenarios: How each team can advance to the Round of 16 https://t.co/o0G2ckcb5p

ERROR
4/500: 9jaheadies @ Sun Jun 20 16:22:59 +0000 2021: #sportingnewsheadlines
Euro 2021 tiebreakers: How groups are decided if teams are tied on points
https://t.co/y2Pf8iuTOH

5/500: emerald_fm @ Sun Jun 20 16:23:17 +0000 2021: RT @ecb: (THREAD) A digital euro would be a powerful push for digitalisation, offering a safe, c
ostless means of payment and allowing inter...

ERROR
7/500: henson49_50 @ Sun Jun 20 16:23:47 +0000 2021: Fantasy Football Scout: The latest EURO 2020 injury updates and team news for Matchday 3.
https://t.co/yEHfVVE1sl

via @GoogleNews

8/500: TelegraphSport @ Sun Jun 20 16:24:04 +0000 2021: #ITA 0 #WAL 0: A couple of nervy moments for Wales as Italy start strongly. Live updates wit
h @alantyers here... https://t.co/1hb5barWaF

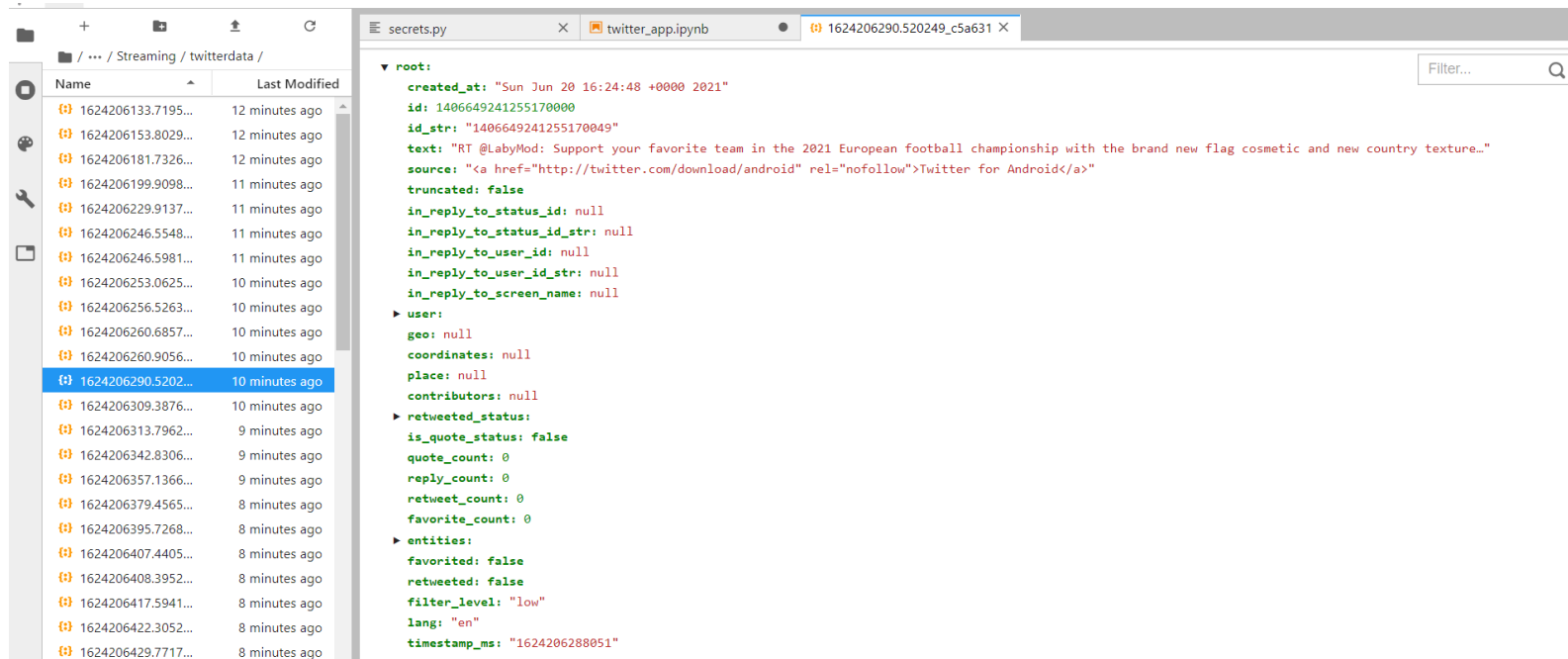
9/500: TeleFootball @ Sun Jun 20 16:24:04 +0000 2021: #ITA 0 #WAL 0: A couple of nervy moments for Wales as Italy start strongly. Live updates with
@alantyers here... https://t.co/kmI8ly4T8l

10/500: henson40 @ Sun Jun 20 16:24:10 +0000 2021: Fantasy Football Scout: The latest EURO 2020 injury updates and team news for Matchday 3.
https://t.co/go2d5RJCYe

via @GoogleNews

11/500: BluMyst @ Sun Jun 20 16:24:14 +0000 2021: RT @newsmax: "[Biden] was all carrot and no stick," former Secretary of State @MikePompeo said, "T
hat won't work with Vladimir Putin, but I...
```

Create Twitter App



The screenshot shows a Jupyter Notebook interface with two tabs: 'secrets.py' and 'twitter_app.ipynb'. The 'twitter_app.ipynb' tab is active, displaying a list of tweets on the left and the details of a selected tweet on the right.

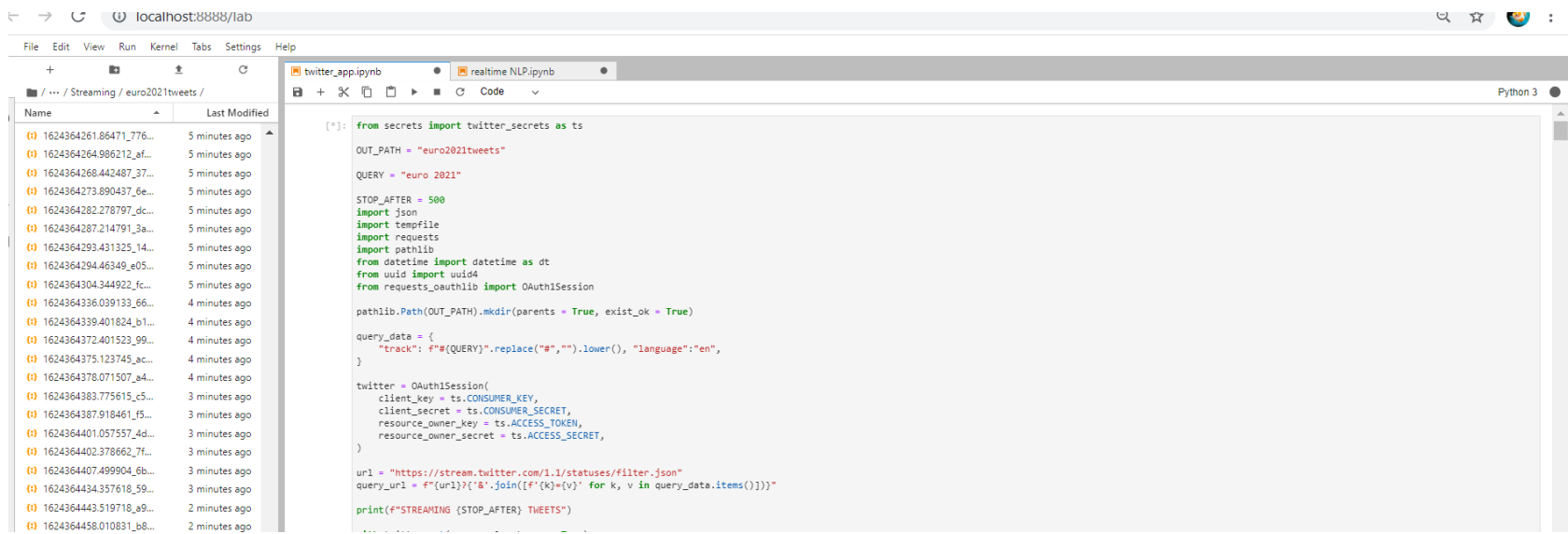
Tweet List (Left Panel):

Name	Last Modified
1624206133.7195...	12 minutes ago
1624206153.8029...	12 minutes ago
1624206181.7326...	12 minutes ago
1624206199.9098...	11 minutes ago
1624206229.9137...	11 minutes ago
1624206246.5548...	11 minutes ago
1624206246.5981...	11 minutes ago
1624206253.0625...	10 minutes ago
1624206256.5263...	10 minutes ago
1624206260.6857...	10 minutes ago
1624206260.9056...	10 minutes ago
1624206290.5202...	10 minutes ago
1624206309.3876...	10 minutes ago
1624206313.7962...	9 minutes ago
1624206342.8306...	9 minutes ago
1624206357.1366...	9 minutes ago
1624206379.4565...	8 minutes ago
1624206395.7268...	8 minutes ago
1624206407.4405...	8 minutes ago
1624206408.3952...	8 minutes ago
1624206417.5941...	8 minutes ago
1624206422.3052...	8 minutes ago
1624206429.7717...	8 minutes ago

Tweet Details (Right Panel):

```
root:
  created_at: "Sun Jun 20 16:24:48 +0000 2021"
  id: 1406649241255170000
  id_str: "1406649241255170049"
  text: "RT @LabyMod: Support your favorite team in the 2021 European football championship with the brand new flag cosmetic and new country texture..."
  source: "<a href='\"http://twitter.com/download/android\"' rel='nofollow'>Twitter for Android</a>"
  truncated: false
  in_reply_to_status_id: null
  in_reply_to_status_id_str: null
  in_reply_to_user_id: null
  in_reply_to_user_id_str: null
  in_reply_to_screen_name: null
  user:
    geo: null
    coordinates: null
    place: null
    contributors: null
  retweeted_status:
    is_quote_status: false
    quote_count: 0
    reply_count: 0
    retweet_count: 0
    favorite_count: 0
  entities:
    favorited: false
    retweeted: false
    filter_level: "low"
    lang: "en"
    timestamp_ms: "1624206288051"
```

Real-time sentiment analysis



The screenshot displays a JupyterLab environment running on localhost:8888/lab. The interface is divided into two main sections: a file explorer on the left and a code editor on the right.

File Explorer: The left sidebar shows a directory structure. The current view is 'Streaming / euro2021tweets'. It lists 20 files, each with a name, a timestamp, and a 'Last Modified' date. The files are named with IDs and timestamps, such as '1624364261.86471_776...' and '1624364264.986212_af...'. The timestamps range from '5 minutes ago' to '2 minutes ago'.

Code Editor: The right sidebar shows a code editor with a file named 'twitter_app.ipynb'. The code is written in Python and is as follows:

```
[*]: from secrets import twitter_secrets as ts

OUT_PATH = "euro2021tweets"

QUERY = "euro 2021"

STOP_AFTER = 500
import json
import tempfile
import requests
import pathlib
from datetime import datetime as dt
from uuid import uuid4
from requests_oauthlib import OAuth1Session

pathlib.Path(OUT_PATH).mkdir(parents = True, exist_ok = True)

query_data = {
    "track": f"{QUERY}".replace("#", "").lower(), "language": "en",
}

twitter = OAuth1Session(
    client_key = ts.CONSUMER_KEY,
    client_secret = ts.CONSUMER_SECRET,
    resource_owner_key = ts.ACCESS_TOKEN,
    resource_owner_secret = ts.ACCESS_SECRET,
)

url = "https://stream.twitter.com/1.1/statuses/filter.json"
query_url = f"{url}?{'&'.join([f'{'k'}={v}' for k, v in query_data.items()])}"

print(f"STREAMING {STOP_AFTER} TWEETS")
```


Real-time sentiment analysis

The screenshot shows a web browser at the URL `nlp.johnsnowlabs.com/2021/01/18/analyze_sentimentdl_use_twitter_en.html`. The John Snow Labs logo is in the top left, and navigation links for Home, Docs, Learn, Models, and Demo are in the top right. The main heading is "Sentiment Analysis of tweets Pipeline (analyze_sentimentdl_use_twitter)". Below the heading are four filter buttons: "en", "sentiment", "pipeline", and "open_source". A "Description" section follows, stating: "A pre-trained pipeline to analyze sentiment in tweets and classify them into 'positive' and 'negative' classes using Universal Sentence Encoder embeddings". At the bottom of the description are three buttons: "Live Demo", "Open in Colab", and "Download". An orange arrow points from the text "Check this" to the "Open in Colab" button.

Check this and also: <https://nlp.johnsnowlabs.com/docs/en/install>

Real-time sentiment analysis

```
stream_writer1 = (sentiment_result.writeStream.queryName("sentiment_result").trigger(processingTime="5 seconds").outputMode("append").format("memory"))
query1 = stream_writer1.start()

stream_writer2 = (sentiment_count_result.writeStream.queryName("data3").trigger(processingTime="5 seconds").outputMode("complete").format("memory"))
query2 = stream_writer2.start()
```

```
if streaming_data_clean.isStreaming:
    from time import sleep
    for x in range(0, 2000):
        try:
            if not query1.isActive:
                print("Query not active")
                break
            print("Showing live view refreshed every 5 seconds")
            print(f"Seconds passed: {x*5}")
            result1 = spark.sql(f"SELECT * from {query1.name}")
            result2 = spark.sql(f"SELECT * from {query2.name}")

            display(result1.toPandas())
            display(result2.toPandas())
            sleep(5)
            clear_output(wait=True)
        except KeyboardInterrupt:
            print("break")
            break
    print("Live view ended...")
else:
    print("Not streaming")
```

Real-time sentiment analysis

Showing live view refreshed every 5 seconds

Seconds passed: 605

	timestamp	user	document	sentiment
0	2021-06-22 19:18:08	barbrady1	RT So the Government wouldn't relax rules to hold the Champions league final at Wembley and sent fans to Portugal wi	negative
1	2021-06-22 18:45:44	sfsams	RT UEFA says no surprising absolutely nobody But Munich should do it anyway pay the fine Make UEFA answer all the ques	negative
2	2021-06-22 18:52:52	DuncMcKay	RT Because Public Health England a professional fucking body of experts deemed it so Grow up	negative
3	2021-06-22 18:40:53	LuluBisserier	RT Shame	neutral
4	2021-06-22 19:09:39	F1Emz	RT UEFA is a joke Acknowledging that LGBTQ people exist and deserve equal treatment is not a political statement	negative
...
285	2021-06-22 19:30:22	cfcc_connor	RT Jack Grealish to START for England tonight Praise the Lord Team news story here ENG AVFC	positive
286	2021-06-22 19:30:22	AkumiahJ	RT Jack Grealish to START for England tonight Praise the Lord Team news story here ENG AVFC	positive
287	2021-06-22 19:30:23	InnoBystander	What could possibly go wrong	negative
288	2021-06-22 19:30:24	WesthamDeku_	Saucy	positive
289	2021-06-22 19:30:25	DistinctToday	Euro Denmark's incredible moment as players find out they've reached the last	positive

290 rows × 4 columns

	sentiment	count
0	positive	173
1	neutral	15
2	negative	93



Cảm ơn đã theo dõi

Chúng tôi hy vọng cùng nhau đi đến thành công.