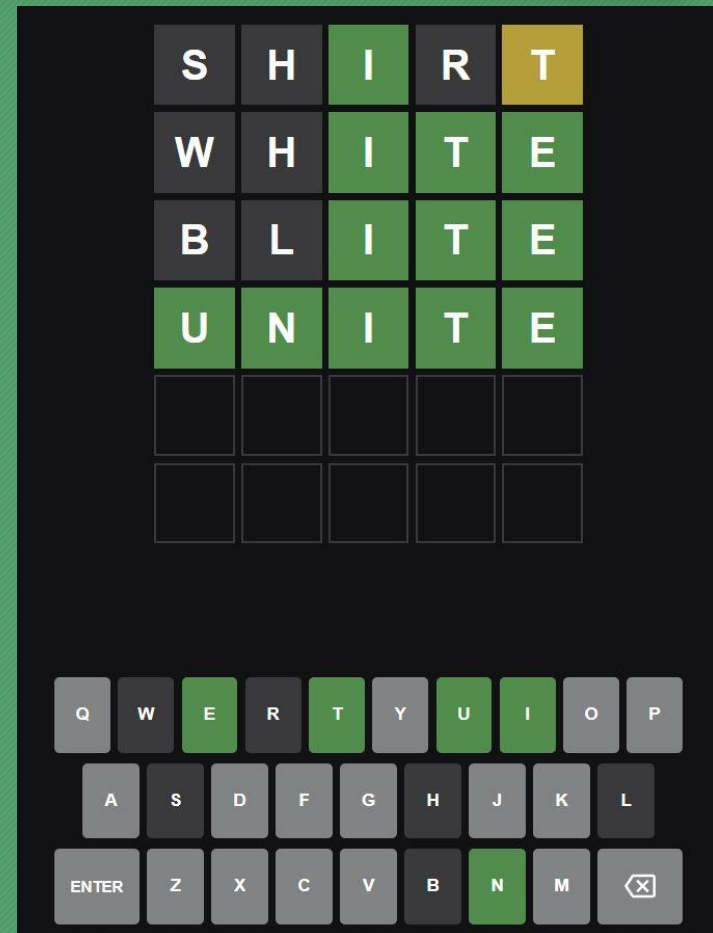


Wordle Match

Team 1 - Ayush Venkatesh, Olasunkanmi Olayinka,
Sai Sumana Puppala, Jared Girouard

Wordle

- 5-letter word
- 6 guesses
- No color - letter not in word
- Yellow - letter in word but wrong position
- Green - letter in word in correct position

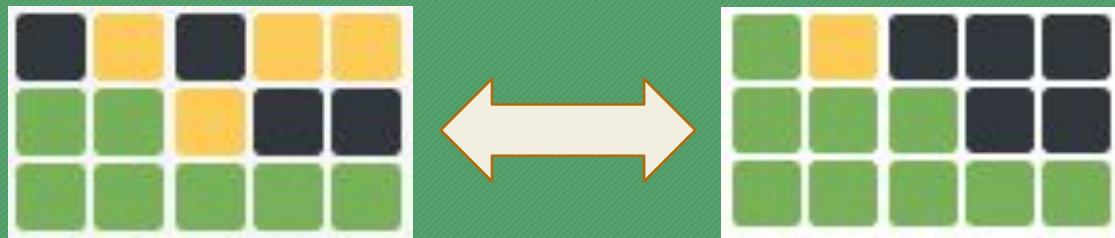


Use Cases

- System queries wordle tweets once each day.
- Top 10 User Search
 - Given a user, provide top 10 users with similar game pattern results for a specific day
- On a given day, compute user rankings based on scores.

Methodology

- Data Collection and Analysis
 - Extract wordle game results of users from Twitter API, over a period.
 - Clean and transform data to get 5*6 pattern matrices of game results.
- User Match
 - Compute user similarity scores among user game result matrices using a Euclidean distance metric.
- Dashboards
 - Build dashboard to display top 10 similar users.

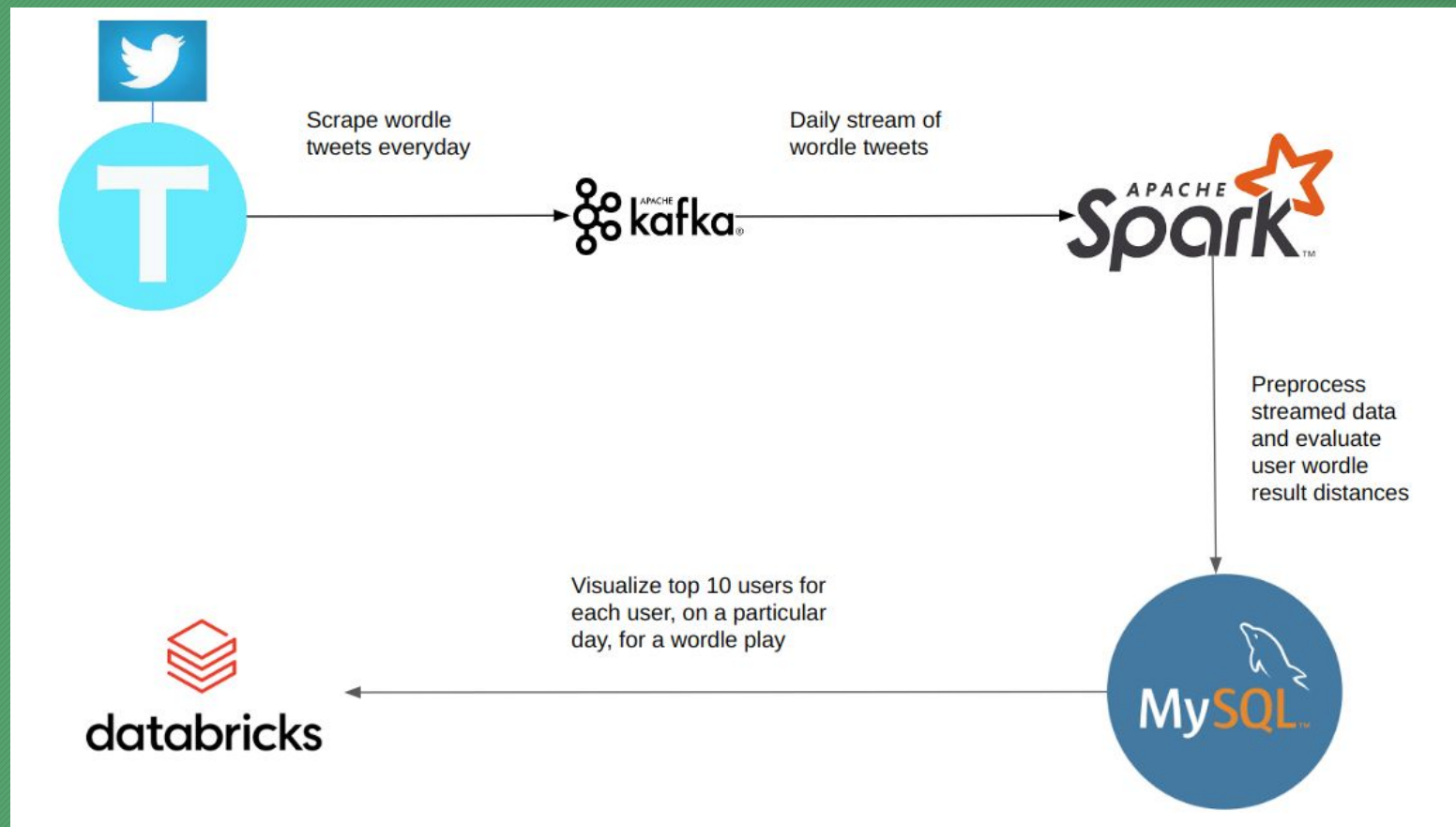


Dashboard

Wordle User Comparison

#	Top 10 User	Original	Comparison:
1	gavrichards77	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>
2	EwanToo	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>
3	PhotoAmy33	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>
4	2kay2kay	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>
5	jeffreadwrite	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>
6	DrJanWF	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>
7	simplysham	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>
8	brian_wxb	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>
9	aclearaxle	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>
10	tbuzzard	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>	<div><div></div><div></div><div></div><div></div><div></div><div></div></div> <div><div></div><div></div><div></div><div></div><div></div><div></div></div>

Architecture



Data Sources

- Data was extracted via twint, a twitter tool, each day.
 - User who posted the tweet
 - Created date
 - Wordle score
 - Date/Time
- Live stream of data preprocessed before storing it in mysql database.
- Extracted data for the last 8 days, accounting to 117k user distances.



Data Sources: Raw Stream

```

1600681154335711232 2022-12-07 21:38:21 -0500 <thewonderer> Wordle 536 4/6 ██████████
1600681153886752769 2022-12-07 21:38:20 -0500 <thebouncingbird> We're breaking our Wordle streak tomorrow! Don't cross the picket line, people!
1600681131904376832 2022-12-07 21:38:15 -0500 <beans_inclass> Wordle 537 X/6 🐸🐸🐸🐸
1600681128125378562 2022-12-07 21:38:14 -0500 <feathersong> I finally gave in and played Wordle day before yesterday. Then I found a link to play past puzzles. Resistance is futile.
1600681112124391425 2022-12-07 21:38:11 -0500 <aggarwal_rupesh> #Wordle537 Wordle 537 5/6 ████████
1600681100115906567 2022-12-07 21:38:08 -0500 <jbrady177> Wordle 536 4/6 ████████
1600681098287058944 2022-12-07 21:38:07 -0500 <HossOUTATIME> Wordle 537 2/6 ██████████ We did this together. I am very grateful to my sexy amazing girlfriend @Laura_pean for helping me. Xxxxx XxxxX XXXXX XXXXX
1600681058970005504 2022-12-07 21:37:58 -0500 <mahyOps> No wordle tomorrow folks
1600681050031652865 2022-12-07 21:37:56 -0500 <nkatnite825> Wordle 536 3/6 ████████
1600681039256784896 2022-12-07 21:37:53 -0500 <StephenWasko> Too many too soon?! @JackieWasko Wordle 535 4/6 ████████
1600681016565309440 2022-12-07 21:37:48 -0500 <mrxpr> Wordle 536 4/6 ████████
1600681007451029504 2022-12-07 21:37:46 -0500 <Rutxtng> Not the Wordle! 😂😂😂
1600680974131421185 2022-12-07 21:37:38 -0500 <JJcc1961> Wordle 536 2/6 ████████
1600680954053402624 2022-12-07 21:37:33 -0500 <vaxxed2thamax> Wordle 536 2/6 ████████
1600680939205677056 2022-12-07 21:37:29 -0500 <Edkhine> Wordle 536 6/6 ██████████
1600680933459636224 2022-12-07 21:37:28 -0500 <raghavKudar> Wordle 537 6/6 ██████████ Streak:279*
1600680886839955458 2022-12-07 21:37:17 -0500 <vjshankar> Wordle 537 3/6 ████████
1600680879000663344 2022-12-07 21:37:15 -0500 <ALNewsNetwork> "Wordle," "Ukraine," and "Johnny Depp" among top Google searches for 2022 https://t.co/JENj0EfQnW
1600680874986868736 2022-12-07 21:37:14 -0500 <ano_bashode> Gonna have to break the wordle streak 😞😞😞😞😞😞
1600680874378694656 2022-12-07 21:37:14 -0500 <jioih1n> @manpageman Wordle 537 5/6* ████████
1600680865574576130 2022-12-07 21:37:12 -0500 <rwexlerealxva> I'd rather lose a streak than be a Wordle scab!
1600680859857723392 2022-12-07 21:37:10 -0500 <p martin UdeM> 🔥🔥🔥 Wordle 536 3/6 ████████ Le Mot (@WordleFR) #333 3/6 ████████ https://t.co/fqxtzTjftR
1600680852362444800 2022-12-07 21:37:09 -0500 <nadzfranz> Wordle 537 4/6 ████████
1600680824726499329 2022-12-07 21:37:02 -0500 <VijayashankarSM> Wordle 537 3/6 ████████
1600680820854898694 2022-12-07 21:37:01 -0500 <theOSCAtNFHS> Wordle 536 5/6 ████████
1600680774788734977 2022-12-07 21:36:50 -0500 <whooomeee> Wordle 537 4/6* ████████ なんかに閃いた
1600680742912405505 2022-12-07 21:36:42 -0500 <julielarenbach> If you're respecting the digital strike tomorrow re: NYT and you have a crossword streak going, tomorrow's puzzle drops in about 30 minutes, and then you can do Friday on F riday and maintain the streak. No work around for Wordle or the Bee, unfortunately.
1600680704521957376 2022-12-07 21:36:33 -0500 <SaraSalley> I'm ready 🍌 Wordle 536 3/6 ████████
1600680684959535104 2022-12-07 21:36:29 -0500 <aansagitade> Ronaldo Malgy Razzien Hazard しずちゃん Grey Stage 6 ポルトガル2部オリバイレンセ入団 Jennifer Lawrence Unschildsvermutung FFAA Contreras Wordle 537 Ivan Chilled Cumbria Tyleno l Biagio outback queensland Elanga Verfassungsschutz https://t.co/LzhMrjrvcZ
1600680663342092289 2022-12-07 21:36:24 -0500 <dabbiefint> Wordle 537 5/6 ████████ Unlucky fourth guess :-))
1600680645604544512 2022-12-07 21:36:19 -0500 <pwr2dpl> Break your #wordle streak.
1600680598552444928 2022-12-07 21:36:08 -0500 <yachirin> Wordle 537 3/6 ████████
1600680593020227584 2022-12-07 21:36:07 -0500 <jeanakadlec> no wordle or spelling bee tomorrow, friends!
1600680573689032709 2022-12-07 21:36:02 -0500 <emv52> Avoid Wordle Thursday #Solidarity @RockpathHW @WSpriggs @driscollc @NHLABOR_NEWS
1600680558082019329 2022-12-07 21:35:58 -0500 <1980Dorothy> Wordle 536 4/6 ████████
1600680488452210688 2022-12-07 21:35:42 -0500 <Aeee2005> Wordle 536 3/6* ████████
1600680478171836416 2022-12-07 21:35:39 -0500 <SparklayBarclay> Wordle 536 3/6 ████████
1600680477127757824 2022-12-07 21:35:39 -0500 <feneriss> Wordle Türkiye 537 3/6 ████████ https://t.co/06UudBzAoG
1600680476888694784 2022-12-07 21:35:39 -0500 <mOncher1> Wordle 537 6/6 ██████████
1600680472635445254 2022-12-07 21:35:38 -0500 <stigaasheim> Wordle 537 6/6 ██████████
1600680456214962177 2022-12-07 21:35:34 -0500 <basultoshow> Wordle 537 🇯🇵ありかと❤️ https://t.co/ZidqeVwbp
1600680443233255424 2022-12-07 21:35:31 -0500 <Adee2005> @AdmiralBear01 @drculaic @atomsareenough @TwistNHook @katsier @paleodaniel @BerkeleyFog @peter_symonds @califorleanian @Lesmith529 @terencelau @nyt_wordle_bot @BethLapachet @AnthonyMaul @avinashkunnath @Fyght4Cal @CNHarder @Andrea_Joh @renaissance @NorCaNickw4C @donglover @aaazlant @Sling @Disney My music tastes have changed since middle school. Once in a while I put on some BSB for old times sake.
1600680435918307337 2022-12-07 21:35:29 -0500 <Reauxtweets> Wordle 536 2/6 ████████ https://t.co/PmwoDAOVJS
1600680435180527616 2022-12-07 21:35:29 -0500 <XShipper> Wordle 537 6/6 ██████████ What is that?

```


Data Transformation

- Data extracted via twint is extremely raw; unicode formatted data. A series of transformations done to compute wordle sequence vectors.
 - Regex transformations: series of regex extract and replacements to decode unicode characters.
 - Formatting the extracted string to the right format to computer vectors; fill a partial wordle result to a full flattened matrix (5*6): vector size 30
 - Computing a vector of doubles for distance calculation from a string sequence representing wordle result.
- Compute all pair user distances for users each day before writing to database

Snapshot of transformed data

created_at	date	timezone	username	tweet	tweetClean
1670369209000	2022-12-06 18:26:49	-500	marioskbar	-0.3,-0.3,-0.3,-0.3,0.5,1.0,0.5,-0.3,-0.3,-0.3,1.0,-0.3,-0.3,1.0,1.0...	
1670369185000	2022-12-06 18:26:25	-500	nicoleaabbott	-0.3,-0.3,-0.3,1.0,1.0,-0.3,0.5,-0.3,1.0,1.0,1.0,-0.3,-0.3,1.0,1.0,1...	
1670369203000	2022-12-06 18:26:43	-500	Maurizio	-0.3,-0.3,-0.3,-0.3,-0.3,-0.3,0.5,-0.3,-0.3,-0.3,0.5,-0.3,1.0,-0.3,1...	
1670369196000	2022-12-06 18:26:36	-500	cherekay	-0.3,-0.3,1.0,-0.3,-0.3,-0.3,1.0,1.0,-0.3,1.0,1.0,1.0,1.0,1.0,0...	
1670369176000	2022-12-06 18:26:16	-500	milner2	0.5,0.5,0.5,-0.3,-0.3,1.0,0.5,-0.3,1.0,-0.3,1.0,1.0,1.0,1.0,1.0,0...	
1670369250000	2022-12-06 18:27:30	-500	mums_hugs	-0.3,-0.3,-0.3,1.0,-0.3,-0.3,-0.3,1.0,1.0,-0.3,1.0,1.0,1.0,1.0,1.0,0...	
1670369210000	2022-12-06 18:26:50	-500	Poubelle_T	0.5,-0.3,-0.3,-0.3,-0.3,0.5,-0.3,0.5,-0.3,1.0,-0.3,1.0,-0.3,1.0,1.0...	
1670369213000	2022-12-06 18:26:53	-500	saruhashy	-0.3,-0.3,-0.3,-0.3,-0.3,-0.3,1.0,-0.3,-0.3,-0.3,1.0,1.0,-0.3,-0.3,0...	
1670369267000	2022-12-06 18:27:47	-500	m_masa_m...	0.5,-0.3,-0.3,-0.3,-0.3,-0.3,1.0,1.0,1.0,-0.3,1.0,1.0,1.0,1.0,1.0,0...	
1670369274000	2022-12-06 18:27:54	-500	artymaggie	-0.3,-0.3,0.5,-0.3,-0.3,0.5,0.5,-0.3,-0.3,-0.3,1.0,-0.3,0.5,0.5,0.5,...	
1670369184000	2022-12-06 18:26:24	-500	peachiekeehn	-0.3,-0.3,-0.3,-0.3,-0.3,-0.3,0.5,0.5,1.0,-0.3,0.5,0.5,0.5,1.0,-0.3,...	
1670369169000	2022-12-06 18:26:09	-500	EaboutTV	-0.3,0.5,-0.3,-0.3,-0.3,1.0,-0.3,-0.3,-0.3,-0.3,1.0,-0.3,0.5,1.0,-0....	
1670369267000	2022-12-06 18:27:47	-500	_kaihime	-0.3,-0.3,0.5,0.5,0.5,0.5,1.0,1.0,0.5,-0.3,-0.3,1.0,1.0,1.0,1.0,-0....	
1670369099000	2022-12-06 18:24:59	-500	CharlesFran...	-0.3,-0.3,-0.3,-0.3,-0.3,-0.3,1.0,-0.3,1.0,1.0,-0.3,1.0,-0.3,1.0,1.0...	
1670369167000	2022-12-06 18:26:07	-500	lonelywxh	-0.3,-0.3,-0.3,-0.3,1.0,-0.3,-0.3,1.0,-0.3,1.0,-0.3,-0.3,1.0,1.0,-0....	
1670369239000	2022-12-06 18:27:19	-500	giraffegirl68	1.0,-0.3,0.5,0.5,-0.3,1.0,1.0,1.0,1.0,1.0,0.0,0.0,0.0,0.0,0.0,0...	
1670369198000	2022-12-06 18:26:38	-500	ogbenyiegbe	-0.3,0.5,-0.3,1.0,1.0,-0.3,-0.3,1.0,1.0,1.0,1.0,1.0,1.0,1.0,1.0,0...	
1670369157000	2022-12-06 18:25:57	-500	wiccan95	-0.3,-0.3,-0.3,0.5,-0.3,0.5,-0.3,-0.3,-0.3,-0.3,0.5,0.5,0.5,-0.3,-0....	
1670369275000	2022-12-06 18:27:55	-500	star_of_bba	-0.3,-0.3,-0.3,-0.3,-0.3,0.5,1.0,1.0,-0.3,-0.3,-0.3,1.0,1.0,1.0,-0.3...	
1670369206000	2022-12-06 18:26:46	-500	masamune_...	-0.3,-0.3,-0.3,1.0,-0.3,-0.3,1.0,1.0,0.5,-0.3,-0.3,1.0,1.0,1.0,1.0,-...	
1670369124000	2022-12-06 18:25:24	-500	jbcampo1	-0.3,-0.3,-0.3,-0.3,0.5,-0.3,0.5,-0.3,0.5,-0.3,0.5,0.5,0.5,-0.3,-0.3...	
1670369108000	2022-12-06 18:25:08	-500	juztimepass	-0.3,-0.3,-0.3,-0.3,-0.3,-0.3,-0.3,1.0,-0.3,-0.3,1.0,-0.3,-0.3,-0.3,-...	
1670369149000	2022-12-06 18:25:49	-500	californiarby	1.0,-0.3,-0.3,-0.3,-0.3,1.0,-0.3,0.5,0.5,-0.3,1.0,1.0,1.0,1.0,1.0,0...	

Tests: Parse Tweets

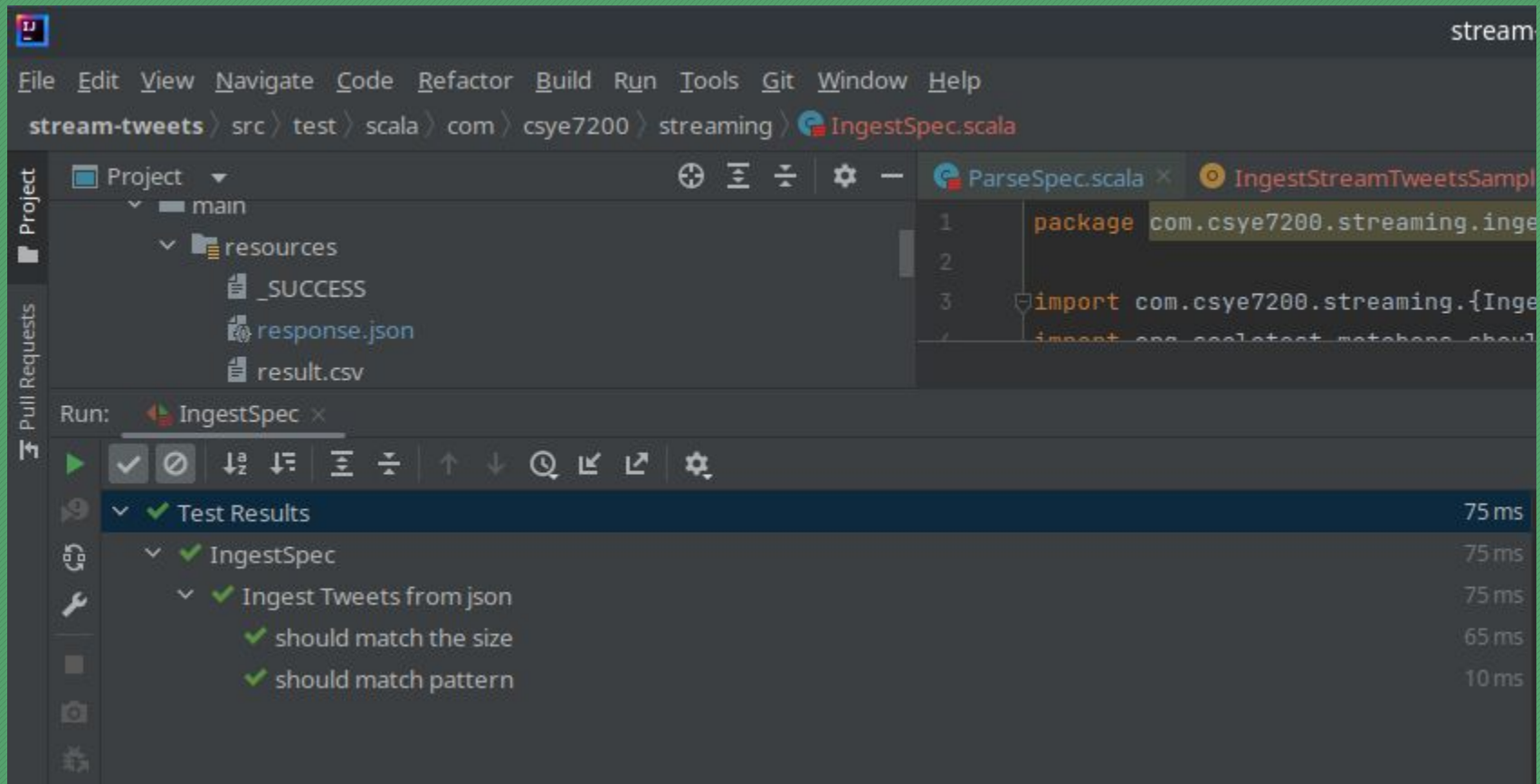
The screenshot shows an IDE window with the following components:

- Project Explorer:** Shows the project structure with folders `main` and `resources`. The `resources` folder contains files `_SUCCESS`, `response.json`, and `result.csv`.
- Code Editor:** Displays the `ParseSpec.scala` file. The visible code includes:

```
1 package com.csye7200.streaming
2
3 import org.apache.spark.sql.{SparkSession, Dataset}
```
- Run Panel:** Shows the test results for `ParseSpec`. The results are as follows:

Test Category	Test Name	Duration
Test Results		399 ms
ParseSpec		399 ms
Regex Transformations		397 ms
	✓ should regex check to trim spaces in tweet	90 ms
	✓ should regex check to extract unicode characters from tweet	74 ms
	✓ should BReplace: regex check to replace black tiles from tweet	61 ms
	✓ should YReplace: regex check to replace yellow tiles with Y from tweet	60 ms
	✓ should GReplace: regex check to replace green tiles with G from tweet	56 ms
	✓ should BWRReplace: regex check to replace white tiles with B from tweet	56 ms
preProcessing		2 ms
	✓ should udftrimStringSeq: trim spaces for a given string	1 ms
	✓ should udfcheckStringSeqSize:filterSpec: check String size <=30	0 ms
	✓ should udfFillTweet: fill tweet when size less than 30	0 ms
	✓ should udfStrReplace: replace string formatted doubles to sequence of doubles	1 ms

Tests: Ingest Tweets



The screenshot shows an IDE window with the following components:

- Project Explorer:** Displays the project structure with folders `main` and `resources`. The `resources` folder contains files `_SUCCESS`, `response.json`, and `result.csv`.
- Code Editor:** Shows the file `IngestSpec.scala` with the following code:

```
1 package com.csye7200.streaming.ingest
2
3 import com.csye7200.streaming.{IngestStreamTweetsSample, ParseSpec}
4 import org.scalatest.matchers.should.Matchers
```
- Run Console:** Shows the command `Run: IngestSpec` and a toolbar with icons for running, stopping, and other actions.
- Test Results:** A table showing the results of the tests:

Test Results	75 ms
✓ IngestSpec	75 ms
✓ Ingest Tweets from json	75 ms
✓ should match the size	65 ms
✓ should match pattern	10 ms

Milestones

- Sprint 1 (11/6-11/12): Define requirements and create repository
- Sprint 2 (11/13 - 11/19): Data collection
- Sprint 3 (11/20 - 11/26): Data collection and data cleaning
- Sprint 4 (11/27 - 12/3): Data visualization
- Sprint 5 (12/4 - 12/8): Finalize Data visualization

Use of Scala

- Spark consumer gets data from Kafka
- Scala processes and transforms before writing it to the database
- Spark parallelly computes user similarity scores using Euclidean distance (best metric evaluated).
- Databricks visualizes data with Scala.

Clustering of users - Additional

- Given the users, and the distance between each pair of users, use the k-means clustering algorithm to find clusters.
- Use the in-built `mllib.clustering` library in Databricks.
- Idea is to find the optimal number of centroids by iterating through a range, computing the error (SSE).
- Find the number of centroids which produce the least error.
- Using this, visualize the clusters graphically.

Goals

- Demonstrate uses of Scala and Spark by creating an end-to-end project that extracts, transforms and visualizes data from an API.
- Create a similarity matrix among all users that shows how similar a player's wordle attempts were to other players.
- Visualize the top 10 performing players for a given user.
- (If time permits) Create graphs of commonly occurring words.
(Did not achieve)

Acceptance Criteria

- 1 million rows are extracted. (Actual: 2500 per day, more than 117k rows after distance calculations)
- User search response in 5 seconds. (Actual: 4.73 seconds on Databricks community)
- Distance metric gives a similarity score of at least 75% in the range of a base metric. (Actual: N/A since we chose to use Euclidean distance)
- Data is extracted twice a day. (Actual: Data is extracted once a day, user distances calculated eod)