Projekat 1 – Big data

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Skup podataka - Brightkite check ins

Brightkite je nekada bio provajder društvenih mreža zasnovan na lokaciji, gde su koriscnici delili svoje lokacije. Prikupljeno je 4 491 143 čekiranja korisnika, odnosno prijavljivanja na određenu lokaciju. Atributi koji su zastupljeni u skupu podataka su:

- User id korisnika
- Check_in_time vreme prijave na određenu lokaciju
- Longitude geografska dužina lokacije
- Latitute geografska širina lokacije
- Location_id id lokacije

Primer slogova u skupu podataka

```
|2010-10-17 03:48:53|39.747652|-104.99251 |88c46bf20db295831bd2d1718ad7e6f5
0
I 0
    |2010-10-16 08:02:04|39.891383|-105.070814|7a0f88982aa015062b95e3b4843f9ca2
0
    |2010-10-16 05:48:54|39.891077|-105.068532|dd7cd3d264c2d063832db506fba8bf79
0
    |2010-10-14 20:25:51|39.750469|-104.999073|9848afcc62e500a01cf6fbf24b797732f8963683|
0
    |2010-10-14 02:21:47|39.752713|-104.996337|2ef143e12038c870038df53e0478cefc
10
    |2010-10-14 01:31:51|39.752508|-104.996637|424eb3dd143292f9e013efa00486c907
I 0
    |2010-10-13 22:05:43|39.7513 |-105.000121|d268093afe06bd7d37d91c4d436e0c40d217b20a|
0
    |2010-10-13 18:41:35|39.758974|-105.010853|6f5b96170b7744af3c7577fa35ed0b8f
0
    |2010-10-13 05:57:23|39.827022|-105.143191|f6f52a75fd80e27e3770cd3a87054f27
    |2010-10-12 21:56:49|39.749934|-105.000017|b3d356765cc8a4aa7ac5cd18caafd393
I 0
```

Filtriranje

- ➤ Iz skupa podataka izdavjamo oblast koja se nalazi između 40. i 60. stepena geografske širine, i, između -104. i -120. stepena geografske dužine.
- ➤ Kao vremenski prozor koji posmaramo, uzimamao dane između 15.10.2010. i 31.10.2010. godine.

```
filtered_df = df.filter(_(df["latitude"] > latitude_lower) & (df["latitude"] < latitude_upper) & (df["longitude"] < longitude_upper) & (df["longitude"] > longitude_lower) & (df["check_in_time"] > date_lower) & (df["check_in_time"] < date_upper))
```

Broj pojavljivanja korisnika u prethodno definisanoj oblasti i vremenskom intervalu

```
grouped_df = filtered_df.groupBy("user").count().alias("count")
result = grouped_df.select("user", "count")
result.show()
```

Ukupan broj prijavljivanja na određenu lokaciju koja pripada prethodno definisanoj oblasti, u definisanom vremenskog okviru

```
grouped_df = filtered_df.groupBy("location_id").count().alias("count")
result = grouped_df.select("location_id", "count")
result.show()
```

```
Podaci grupisani po lokacijama, za odredjenu oblast i odrjenji vremenski interval
          location_id|count|
|9a404eee49b47d7df...|
|5f9fd804781871335...|
                           11
|eebadad0a22411ddb...|
                           11
|7b062c7e83141c131...|
                           11
|1ab85b9dff61c977b...|
                           11
                           2|
|d22e7db4cb988d813...|
|5d2db576912de7550...|
                           11
lf52bde44aa45c171a...l
                           11
|f54c489c05b23dfcd...|
                           11
|eeffd054a22411ddb...|
                           21
eeb9db9ea22411dd8...
                           11
eeb46b50a22411dda...
                           11
```

Kolona – time_spent

Veštački je generisana nova kolona "time_spent", koja sadrži informaciju o tome koliko je korinsik proveo vremena na nekoj lokaciji. Skup podaka nakon dodavanja te kolone je prikazan na slici.

```
check in time | latitude | longitude |
                                                          location_id|time_spent|
userl
   0|2010-10-17 03:48:53|39.747652| -104.99251|88c46bf20db295831...|
                                                                              124
   0|2010-10-16 08:02:04|39.891383|-105.070814|7a0f88982aa015062...|
                                                                               99
   0|2010-10-16 05:48:54|39.891077|-105.068532|dd7cd3d264c2d0638...|
                                                                              121
   0|2010-10-14 20:25:51|39.750469|-104.999073|9848afcc62e500a01...|
                                                                              227 I
   0|2010-10-14 02:21:47|39.752713|-104.996337|2ef143e12038c8700...|
                                                                              291 I
   0|2010-10-14 01:31:51|39.752508|-104.996637|424eb3dd143292f9e...|
                                                                              165 I
   0|2010-10-13 22:05:43| 39.7513|-105.000121|d268093afe06bd7d3...|
                                                                              201 I
   0|2010-10-13 18:41:35|39.758974|-105.010853|6f5b96170b7744af3...|
                                                                               78 I
   0|2010-10-13 05:57:23|39.827022|-105.143191|f6f52a75fd80e27e3...|
                                                                              237
   0|2010-10-12 21:56:49|39.749934|-105.000017|b3d356765cc8a4aa7...|
                                                                              178 I
                                                                              29|
   0|2010-10-11 04:51:09|39.891077|-105.068532|6f3a2db56d4fa788f...|
   0|2010-10-09 07:45:25|39.891077|-105.068532|6f3a2db56d4fa788f...|
                                                                              148 I
   0|2010-10-08 05:33:37|39.758974|-105.010853|11da318f0ea3c4a8f...|
                                                                              320 I
```

Kolona – check in date

Dodata je nova kolona, "check_in_date", koja izvlaći informaciju o datumu iz kolone "check_in_time", jer ona sadrži informaciju i o vremenu i o datumu. Ovo je urađeno da bismo u nastavku projekta mogli da grupišemo slogove po datumu.

```
# Dodavanje nove kolone koja ce da sadrzi samo informaciji o datumu

df = df.withColumn("check_in_date", to_date(col("check_in_time"), "yyyy-MM-dd'T'HH:mm:ss'Z'"))
```

Određivanje statističkih parematera za atribut time_spent na ordeđenoj lokacijij, određenog datuma

```
grouped_df = df.groupBy("location_id", "check_in_date").agg(
    min("time_spent").alias("min_time_spent"),
    max("time_spent").alias("max_time_spent"),
    avg("time_spent").alias("avg_time_spent"),
    coalesce(stddev("time_spent"), lit(0.0)).alias("stddev_time_spent")
)
```

```
Podaci grupisani po lokacijama i datumima:
          location_id|check_in_date|min_time_spent|max_time_spent|
                                                                          avg_time_spent| stddev_time_spent|
|dd7cd3d264c2d0638...|
                          2010-04-071
                                                  1111
                                                                  1111
                                                                                    111.01
                                                                                                           0.01
                          2010-03-121
                                                  251 l
                                                                  251 l
                                                                                    251.01
                                                                                                           0.01
|34d9fb11d6e4e875b...|
3c416dba5f9811deb...
                          2010-02-05|
                                                  231 I
                                                                  231 I
                                                                                    231.01
                                                                                                           0.01
6db9d82229f1e0eb2...
                          2010-01-061
                                                    2|
                                                                   35 I
                                                                                     18.5 | 23.33452377915607 |
| 7648bcecaf9911deb...|
                          2009-10-02|
                                                  172|
                                                                  351 I
                                                                                    261.5 | 126.572113832392 |
                                                                                     94.5|132.22896808188437|
|7a22ad4e9e3f11ddb...|
                          2009-08-16|
                                                    1|
                                                                  188 I
12356b384f6c4c8095...l
                          2010-06-241
                                                  325|
                                                                  325|
                                                                                    325.0
                                                                                                           0.01
|901ec5410896ff121...|
                          2010-04-23
                                                   23 I
                                                                   231
                                                                                     23.01
                                                                                                           0.01
                          2010-01-21
|8fde23d6245c11deb...|
                                                  2761
                                                                  345 I
                                                                                    319.2 | 27.79748190034486 |
lee81e0b8a22411dda...l
                                                                  351 | 207.555555555555554 | 122.32856484802629 |
                          2009-07-021
                                                   34
ee6b8534a22411dd9...
                                                   51 I
                                                                  325 I
                                                                                 188.8125 | 69.84575267449458 |
                          2009-04-21
```

Određivanje statističkih parematera za atribut time_spent na ordeđenoj lokacijij, određenog datuma, za svakog korisnika

```
grouped_df = df.groupBy("user", "location_id", "check_in_date").agg(
    min("time_spent").alias("min_time_spent"),
    max("time_spent").alias("max_time_spent"),
    avg("time_spent").alias("avg_time_spent"),
    coalesce(stddev("time_spent"), lit(0.0)).alias("stddev_time_spent")
)
```

Podaci grupisani po lokacijama i datumima, za odredjenog korisnika:											
+ us	er location_id cl		 n_time_spent max_ti								
+											
1	0 7a0f88982aa015062	2010-08-07	8	8	8.0	0.0					
1	0 f6f52a75fd80e27e3	2010-06-30	53	328	190.5 1	94.45436482630058					
-1	0 5b1e75de2fd3acfcb	2009-06-18	338	338	338.0	0.0					
1	0 ec71ac1659d211de9	2009-06-15	245	273	259.0	19.79898987322333					
1	0 0b8d9aa2489d4a8b0	2009-05-27	90	90	90.0	0.0					
1	1 c18334382591a7534	2010-04-02	271	271	271.0	0.0					
1	1 dbacc50b61ae8d7df	2010-03-04	209	209	209.0	0.0					
1	1 e4b85ebcf23911dda	2009-10-19	333	333	333.0	0.0					
1	1 ee8403d4a22411dd8	2009-08-18	229	229	229.0	0.0					
1	1 ee6b8534a22411dd9	2009-05-06	6	6	6.0	0.0					
1	1 ee81e0b8a22411dda	2009-04-03	122	229	183.0 5	5.054518434003214					
	2 6e3768ee94fc11dea	2010-06-16	325	325	325.0	0.01					

Najposećenija lokacija za svakog korisnika

```
|user|max_visits|most_visited_location|
            213| ba494e1ceff294a80...|
            297| c0b8fc511887b932c...|
            247 | 3534836081ca2913b...
            119| 3410de6ca0f4d8c77...|
            132| 9325dd207bed11dea...|
             92| ee81e0b8a22411dda...|
            110| dab6294e732d36c2d...|
            300| 74a3b18100c1bb81d...|
               4| 4080a0d997eaeb739...|
              23| 2d144622e8333f8de...|
   91
  10|
              56 | 737eafcefd83b2554...|
  11|
            441| af9bc69f55fa74cd3...|
  12|
            320| 81091f83e687d1bc0...|
             105| 48697cc9ceb4fe0fb...|
  13|
  141
              63| d9988f09bff65eefb...|
 15|
             464 | 50b5757e7bdc11de9...|
              39| 9e7eacc95b1ed4eec...|
 161
  17|
            155| d1ab6766ae5f31894...|
  18|
             66| f99685b6643511deb...|
  19|
             210 | 9c25dbbc444011deb...|
```

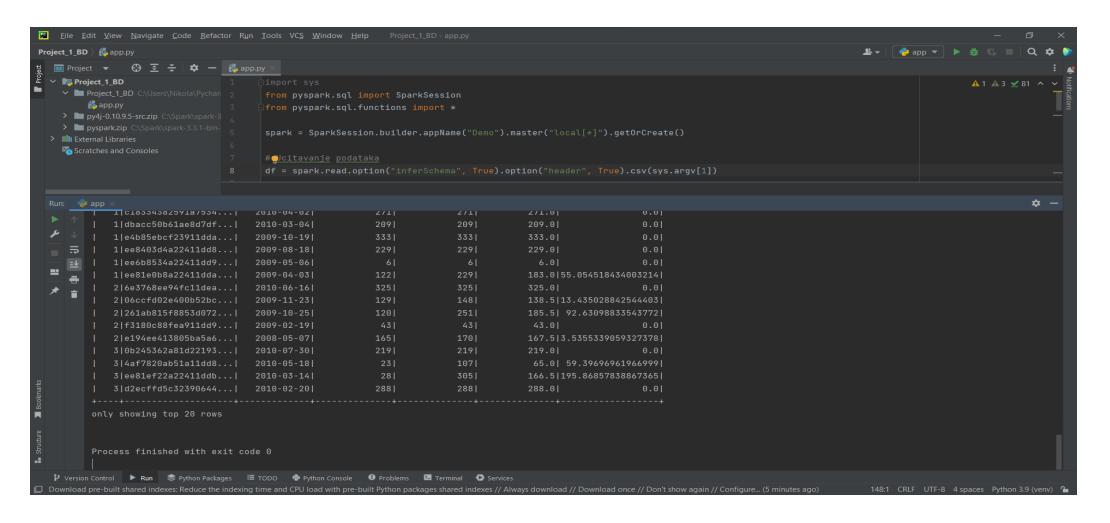
Datumi kada je svaka od lokacija bila najposećenija

```
location_id|max_visits|most_busiest_date|
|6d2b50de917111de9...|
                                 11
                                           2009-08-25 l
                                 41
ld6de67abf64236233...l
                                           2009-12-05
12d766c02ea72f085d...l
                                 3 I
                                           2009-01-12|
|fd8eacc4b1cb11dda...|
                                 5 I
                                           2009-06-16
| 26a11bced05811ddb...|
                                 3 I
                                           2009-06-021
|3033e2d7a560b5a5c...|
                                 21
                                           2008-12-271
|11e6ea3656fe520b7...|
                                 41
                                           2008-12-01
ld1937763c05393367...l
                                 2|
                                           2008-11-16
|5298aa3780e37d294...|
                                 11
                                           2010-02-02|
|3e7f42009fcb11de8...|
                                 11
                                           2009-09-261
|8ee95c686be11deaf...|
                                 11
                                           2009-08-12|
12773ea36c7bfae09c...1
                                 11
                                           2010-08-04
|b6f6070ae12611ddb...|
                                 21
                                           2009-07-251
lc6ad07a0a83911dd8...l
                                 21
                                           2008-11-01|
| 700e4e2929211dda0...|
                                 21
                                           2008-10-301
|15325f65b6662f0b3...|
                                 3 I
                                           2009-09-201
|99774f916e92f1706...|
                                 11
                                           2010-03-21
|659ac30cabcd11dd9...|
                                 11
                                           2008-11-15|
|4d6416d28b5511dd9...|
                                 21
                                           2009-01-301
|f79c95e5936a31191...|
                                 11
                                           2009-12-09|
```

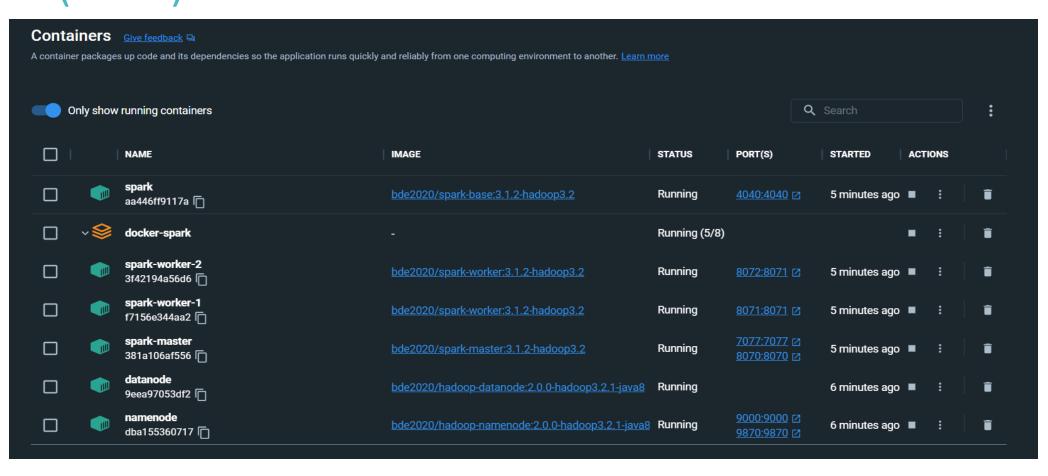
Prosečno vreme provedeno na svakoj od lokacija

```
location_id|
                          avg_time_spent|
|64b925364ac71005a...|
                                   211.51
|31c4ef9bbd5f8ebe2...|
                                   219.7
le5acc4dbe743d713b...l
                                  32.01
ld9ba7fd062dd11de9...l
                                   133.01
                                   306.01
|db3e5b3257cb11dea...|
|8ec18f7210b811deb...|
                                  164.75
13033e2d7a560b5a5c...l
                                  85.41
lca54a3d67bc011dda...l
                                   181.0 l
lcc8795999b01637cf...l
                                   309.01
                                   345.01
l7b9b133c85199c71d...l
lf4491cf2fe7c88fb3...l
                                   185.7I
|abc4c6f75f5453484...|174.57142857142858|
|d2c833d0d13d1c037...|
                                   276.01
l6ce8b78370a37d7b7...l
                                   170.5
lf79c95e5936a31191...|
                                  90.01
|6bdcb8d41bcf11dea...|
                                   198.0I
|4d9b5a6f08993325b...|
                                   296.01
|6d540229c0547a981...|208.33333333333334|
|fd8eacc4b1cb11dda...|170.77083333333334|
|cf86f32c17e211dea...|
                                   324.01
```

Aplikacija u PyCharm-u, na lokalnoj mašini



Aplikacija na klasteru Spark Docker containera (BDE)



Aplikacija na klasteru Spark Docker containera (BDE)

Skripta za pokretanje aplikacije

```
1 #!/bin/bash
2
3 /spark/bin/spark-submit --master spark://spark-master:7077 app.py \
4 hdfs://namenode:9000/dir_proj_1_small 38 40 -120 -104 2010-10-12 2010-10-31
```

Pokretanje aplikacije pomoću navedene skripte

```
oash-5.0# cat ./start_proj_1.sh
 spark/bin/spark-submit --master spark://spark-master:7077 app.py \
   hdfs://namenode:9000/dir_proj_1_small 38 40 -120 -104 2010-10-12 2010-10-31
bash-5.0# ./start proi 1.sh
23/03/21 13:23:58 WARN NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes where applicable
 Using Spark's default log4j profile: org/apache/spark/log4j-defaults.properties
23/03/21 13:23:59 INFO SparkContext: Running Spark version 3.1.2
23/03/21 13:23:59 INFO ResourceUtils: ==
 23/03/21 13:23:59 INFO ResourceUtils: No custom resources configured for spark.driver.
23/03/21 13:23:59 INFO ResourceUtils: ==
23/03/21 13:23:59 INFO SparkContext: Submitted application: Demo
 3/03/21 13:23:59 INFO ResourceProfile: Default ResourceProfile created, executor resources: Map(cores -> name: cores, amount: 1, script: , vendor: , memory -> name: memory, amount: 1024, script: , vendor: , offHeap -> name: offHeap, amount: 0, script: , vendor: ), ta
sk resources: Map(cpus -> name: cpus. amount: 1.0)
23/03/21 13:23:59 INFO ResourceProfile: Limiting resource is cpu
 23/03/21 13:23:59 INFO ResourceProfileManager: Added ResourceProfile id: 0
23/03/21 13:23:59 INFO SecurityManager: Changing view acls to: root
23/03/21 13:23:59 INFO SecurityManager: Changing modify acls to: root
 23/03/21 13:23:59 INFO SecurityManager: Changing view acls groups to:
23/03/21 13:23:59 INFO SecurityManager: Changing modify acls groups to:
23/03/21 13:23:59 INFO SecurityManager: SecurityManager: authentication disabled; ui acls disabled; users with view permissions: Set(root); groups with view permissions: Set(); users with modify permissions: Set(root); groups with modify permissions: Set()
 23/03/21 13:24:00 INFO Utils: Successfully started service 'sparkDriver' on port 43575.
23/03/21 13:24:00 INFO SparkEnv: Registering MapOutputTracker
23/03/21 13:24:00 INFO SparkEnv: Registering BlockManagerMaster
 23/03/21 13:24:00 INFO BlockManagerMasterEndpoint: Using org.apache.spark.storage.DefaultTopologyMapper for getting topology information
23/03/21 13:24:00 INFO BlockManagerMasterEndpoint: BlockManagerMasterEndpoint up
23/03/21 13:24:00 INFO SparkEnv: Registering BlockManagerMasterHeartbeat
 23/03/21 13:24:00 INFO DiskBlockManager: Created local directory at /tmp/blockmgr-6cd54222-6873-450c-9fd2-d68c35dc67c2
23/03/21 13:24:00 INFO MemoryStore: MemoryStore started with capacity 366.3 MiB
23/03/21 13:24:00 INFO SparkEnv: Registering OutputCommitCoordinator
 23/03/21 13:24:00 INFO Utils: Successfully started service 'SparkUI' on port 4040
23/03/21 13:24:00 INFO SparkUI: Bound SparkUI to 0.0.0.0, and started at http://aa446ff9117a:4040
 23/03/21 13:24:01 INFO StandaloneAppClient$ClientEndpoint: Connecting to master spark://spark-master:7077..
 23/03/21 13:24:01 INFO TransportClientFactory: Successfully created connection to spark-master/172.18.0.2:7077 after 44 ms (0 ms spent in bootstraps)
23/03/21 13:24:01 INFO StandaloneSchedulerBackend: Connected to Spark cluster with app ID app-20230321132401-0001
 23/03/21 13:24:01 INFO StandaloneAppClient$ClientEndpoint: Executor added: app-20230321132401-0001/0 on worker-20230321131518-172.18.0.5-34213 (172.18.0.5:34213) with 8 core(s)
 (3/03/21 13:24:01 INFO StandaloneSchedulerBackend: Granted executor ID app-20230321132401-0001/0 on hostPort 172.18.0.5:34213 with 8 core(s), 1024.0 MiB RAM
23/03/21 13:24:01 INFO StandaloneAppClient$ClientEndpoint: Executor added: app-20230321132401-0001/1 on worker-20230321131517-172.18.0.3-42255 (172.18.0.3:42255) with 8 core(s)
 23/03/21 13:24:01 INFO StandaloneSchedulerBackend: Granted executor ID app-20230321132401-0001/1 on hostPort 172.18.0.3:42255 with 8 core(s), 1024.0 MiB RAM
 23/03/21 13:24:01 INFO Utils: Successfully started service 'org.apache.spark.network.netty.NettyBlockTransferService' on port 42087.
23/03/21 13:24:01 INFO NettyBlockTransferService: Server created on aa446ff9117a:42087
 23/03/21 13:24:01 INFO BlockManager: Using org.apache.spark.storage.RandomBlockReplicationPolicy for block replication policy
 3/63/21 13:24:01 INFO BlockManagerMaster: Registering BlockManager BlockManagerId(driver, aa446ff9117a, 42087, None)
23/03/21 13:24:01 INFO BlockManagerMasterEndpoint: Registering block manager aa446ff9117a:42087 with 366.3 MiB RAM, BlockManagerId(driver, aa446ff9117a, 42087, None)
 23/03/21 13:24:01 INFO BlockManagerMaster: Registered BlockManager BlockManagerId(driver, aa446ff9117a, 42087, None)
 23/03/21 13:24:01 INFO BlockManager: Initialized BlockManager: BlockManagerId(driver, aa446ff9117a, 42087, None)
 23/03/21 13:24:01 INFO StandaloneAppClient$ClientEndpoint: Executor updated: app-20230321132401-0001/0 is now RUNNING
 23/03/21 13:24:01 INFO StandaloneAppClient$ClientEndpoint: Executor updated: app-20230321132401-0001/1 is now RUNNING
 13/03/21 13:24:01 INFO StandaloneSchedulerBackend: SchedulerBackend is ready for scheduling beginning after reached minRegisteredResourcesRatio: 0.0
 23/03/21 13:24:02 INFO SharedState: Setting hive.metastore.warehouse.dir ('null') to the value of spark.sql.warehouse.dir ('file:/spark-warehouse').
 23/03/21 13:24:02 INFO SharedState: Warehouse path is 'file:/spark-warehouse'
 olone u skupu podataka: ['user', 'check_in_time', 'latitude', 'longitude', 'location_id', 'time_spent']
Broj slogova: 96165
 Inicijalni skup podataka:
 user|check_in_time |latitude|longitude|location_id
                                                                                        |time_spent|
     2010-10-17 01:48:53 39.747652 -104.99251 88c46bf20db295831bd2d1718ad7e6f5
                                                                                         200
     2010-10-16 06:02:04 39.891383 -105.070814 7a0f88982aa015062b95e3b4843f9ca2
                                                                                        1129
     |2010-10-16 03:48:54|39.891077|-105.068532|dd7cd3d264c2d063832db506fba8bf79
                                                                                        168
      2010-10-14 18:25:51|39.750469|-104.999073|9848afcc62e500a01cf6fbf24b797732f8963683|120
     2010-10-14 00:21:47 39.752713 -104.996337 2ef143e12038c870038df53e0478cefc
```

Web UI za praćenje izvršavanja aplikacije



Spark 3.1.2 Application: Demo

ID: app-20230321132401-0001

Name: Demo User: root

Cores: Unlimited (16 granted) Executor Limit: Unlimited (2 granted) Executor Memory: 1024.0 MiB

Executor Resources:

Submit Date: 2023/03/21 13:24:01

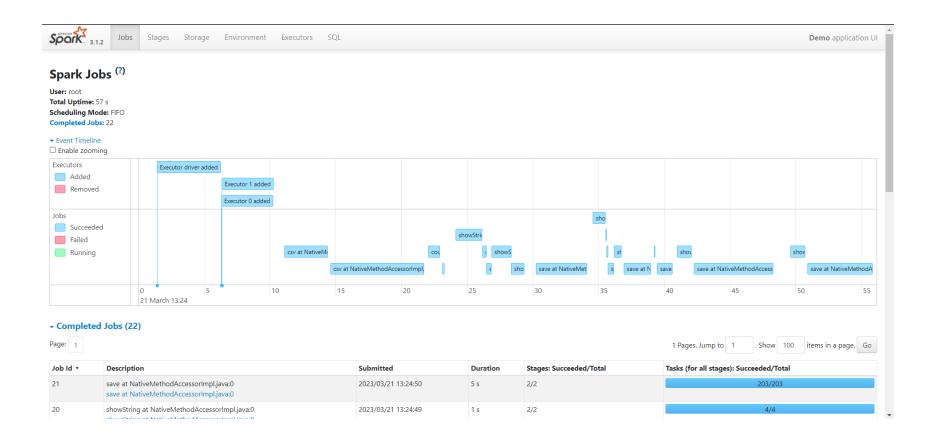
State: RUNNING Application Detail UI

- Executor Summary (2)

ExecutorID	Worker	Cores	Memory	Resources	State	Logs
1	worker-20230321131517-172.18.0.3-42255	8	1024		RUNNING	stdout stderr
0	worker-20230321131518-172.18.0.5-34213	8	1024		RUNNING	stdout stderr

^{*}Web UI Spark Master kontejnera

Web UI za praćenje izvršavanja aplikacije



*Web UI Spark kontejnera(driver-a)

Vreme potrebno za izvršenje aplikacije

➤ Izvršavanje aplikacije na lokalnoj mašini

Vreme potrebno za izvrsenje aplikacije: 51.465081453323364

➤ Izvrašavanje aplikacije u Docker-u, na klasteru kontejnera

Vreme potrebno za izvrsenje aplikacije: 86.67468333244324