Assignment 9.3

May 13, 2023

0.1 Assignment 9.3

```
[1]: import os
     import shutil
     import json
     from pathlib import Path
     import pandas as pd
     import warnings
     warnings.filterwarnings('ignore')
     from kafka import KafkaProducer, KafkaAdminClient
     from kafka.admin.new_topic import NewTopic
     from kafka.errors import TopicAlreadyExistsError
     from pyspark.sql import SparkSession
     from pyspark.streaming import StreamingContext
     from pyspark import SparkConf
     from pyspark.sql.functions import window, from json, col, expr, to json, u
      ⇔struct, when
     from pyspark.sql.types import StringType, TimestampType, DoubleType,
      →StructField, StructType
     from pyspark.sql.functions import udf
     current_dir = Path(os.getcwd()).absolute()
     checkpoint_dir = current_dir.joinpath('checkpoints')
     joined_checkpoint_dir = checkpoint_dir.joinpath('joined')
     if joined_checkpoint_dir.exists():
         shutil.rmtree(joined_checkpoint_dir)
     joined_checkpoint_dir.mkdir(parents=True, exist_ok=True)
```

0.1.1 Configuration Parameters

TODO: Change the configuration prameters to the appropriate values for your setup.

```
[2]: config = dict(
         bootstrap_servers=['kafka.kafka.svc.cluster.local:9092'],
         first_name='Jake',
         last_name='Meyer'
     )
     config['client_id'] = '{}{}'.format(
         config['last_name'],
         config['first_name']
     )
     config['topic prefix'] = '{}{}'.format(
         config['last_name'],
         config['first_name']
     )
     config['locations_topic'] = '{}-locations'.format(config['topic_prefix'])
     config['accelerations_topic'] = '{}-accelerations'.
      →format(config['topic_prefix'])
     config['joined_topic'] = '{}-joined'.format(config['topic_prefix'])
     config
```

0.1.2 Create Topic Utility Function

The create_kafka_topic helps create a Kafka topic based on your configuration settings. For instance, if your first name is *John* and your last name is *Doe*, create_kafka_topic('locations') will create a topic with the name DoeJohn-locations. The function will not create the topic if it already exists.

```
client_id=client_id
)

topic = NewTopic(
    name=name,
    num_partitions=num_partitions,
    replication_factor=replication_factor
)

topic_list = [topic]
try:
    admin_client.create_topics(new_topics=topic_list)
    print('Created topic "{}"'.format(name))
except TopicAlreadyExistsError as e:
    print('Topic "{}" already exists'.format(name))
create_kafka_topic('joined')
```

Topic "MeyerJake-joined" already exists

TODO: This code is identical to the code used in 9.1 to publish acceleration and location data to the LastnameFirstname-simple topic. You will need to add in the code you used to create the df_accelerations dataframe. In order to read data from this topic, make sure that you are running the notebook you created in assignment 8 that publishes acceleration and location data to the LastnameFirstname-simple topic.

```
[21]: spark = SparkSession\
          .builder\
          .appName("Assignment09")\
          .getOrCreate()
      df_locations = spark \
        .readStream \
        .format("kafka") \
        .option("kafka.bootstrap.servers", "kafka.kafka.svc.cluster.local:9092") \
        .option("subscribe", config['locations_topic']) \
        .option("startingOffsets", "earliest") \
        .load()
      ## .option("failOnDataLoss", "false") \
      ## TODO: Add code to create the df accelerations dataframe
      df_accelerations = spark \
        .readStream \
        .format("kafka") \
        .option("kafka.bootstrap.servers", "kafka.kafka.svc.cluster.local:9092") \
        .option("subscribe", config['accelerations_topic']) \
        .option("startingOffsets", "earliest") \
        .load()
```

```
## .option("failOnDataLoss", "false") \
```

The following code defines a Spark schema for location and acceleration data as well as a user-defined function (UDF) for parsing the location and acceleration JSON data.

```
[22]: location_schema = StructType([
          StructField('offset', DoubleType(), nullable=True),
          StructField('id', StringType(), nullable=True),
          StructField('ride_id', StringType(), nullable=True),
          StructField('uuid', StringType(), nullable=True),
          StructField('course', DoubleType(), nullable=True),
          StructField('latitude', DoubleType(), nullable=True),
          StructField('longitude', DoubleType(), nullable=True),
          StructField('geohash', StringType(), nullable=True),
          StructField('speed', DoubleType(), nullable=True),
          StructField('accuracy', DoubleType(), nullable=True),
      ])
      acceleration_schema = StructType([
          StructField('offset', DoubleType(), nullable=True),
          StructField('id', StringType(), nullable=True),
          StructField('ride_id', StringType(), nullable=True),
          StructField('uuid', StringType(), nullable=True),
          StructField('x', DoubleType(), nullable=True),
          StructField('v', DoubleType(), nullable=True),
          StructField('z', DoubleType(), nullable=True),
      ])
      udf_parse_acceleration = udf(lambda x: json.loads(x.decode('utf-8')),_
       →acceleration_schema)
      udf_parse_location = udf(lambda x: json.loads(x.decode('utf-8')),__
       →location schema)
```

TODO:

- Complete the code to create the accelerationsWithWatermark dataframe.
 - Select the timestamp field with the alias acceleration_timestamp
 - Use the udf parse acceleration UDF to parse the JSON values
 - Select the ride_id as acceleration_ride_id
 - Select the x, y, and z columns
 - Use the same watermark timespan used in the locationsWithWatermark dataframe

```
col('location_timestamp'),
    col('json_value.ride_id').alias('location_ride_id'),
    col('json_value.speed').alias('speed'),
    col('json_value.latitude').alias('latitude'),
    col('json_value.longitude').alias('longitude'),
    col('json_value.geohash').alias('geohash'),
    col('json_value.accuracy').alias('accuracy')
 ) \
 .withWatermark('location timestamp', "2 seconds")
## Follow similar suite as locationsWithWatermark as above, but for specified,
 ⇔directions in previous cell.
accelerationsWithWatermark = df_accelerations \
  .select(
    col('timestamp').alias('acceleration_timestamp'),
   udf_parse_acceleration(df_accelerations['value']).alias('json_value')
  ) \
  .select(
    col('acceleration timestamp'),
    col('json_value.ride_id').alias('acceleration_ride_id'),
   col('json value.x').alias('x'),
    col('json_value.y').alias('y'),
    col('json_value.z').alias('z'),
 .withWatermark('acceleration_timestamp', "2 seconds")
```

TODO:

• Complete the code to create the df_joined dataframe. See http://spark.apache.org/docs/latest/structured-streaming-programming-guide.html#stream-stream-joins for additional information.

[24]: DataFrame[location_timestamp: timestamp, location_ride_id: string, speed: double, latitude: double, longitude: double, geohash: string, accuracy: double, acceleration_timestamp: timestamp, acceleration_ride_id: string, x: double, y: double, z: double]

If you correctly created the df_joined dataframe, you should be able to use the following code to create a streaming query that outputs results to the LastnameFirstname-joined topic.

```
[25]: ## Updated ride id to acceleration_ride id due to errors surfacing.
      ds_joined = df_joined \
        .withColumn(
          'value',
          to_json(
              struct(
                  'acceleration_ride_id', 'location_timestamp', 'speed',
                  'latitude', 'longitude', 'geohash', 'accuracy',
                  'acceleration timestamp', 'x', 'y', 'z'
              )
          )
          ).withColumn(
           'key', col('acceleration_ride_id')
        .selectExpr("CAST(key AS STRING)", "CAST(value AS STRING)") \
        .writeStream \
        .format("kafka") \
        .option("kafka.bootstrap.servers", "kafka.kafka.svc.cluster.local:9092") \
        .option("topic", config['joined_topic']) \
        .option("checkpointLocation", str(joined_checkpoint_dir)) \
        .start()
      try:
          ds joined.awaitTermination()
      except KeyboardInterrupt:
          print("STOPPING STREAMING DATA")
     23/05/13 14:00:51 WARN ResolveWriteToStream: spark.sql.adaptive.enabled is not
     supported in streaming DataFrames/Datasets and will be disabled.
     23/05/13 14:00:51 WARN AdminClientConfig: The configuration 'key.deserializer'
     was supplied but isn't a known config.
     23/05/13 14:00:51 WARN AdminClientConfig: The configuration 'value.deserializer'
     was supplied but isn't a known config.
     23/05/13 14:00:51 WARN AdminClientConfig: The configuration 'enable.auto.commit'
     was supplied but isn't a known config.
     23/05/13 14:00:51 WARN AdminClientConfig: The configuration 'max.poll.records'
     was supplied but isn't a known config.
     23/05/13 14:00:51 WARN AdminClientConfig: The configuration 'auto.offset.reset'
     was supplied but isn't a known config.
     23/05/13 14:00:51 ERROR MicroBatchExecution: Query [id =
     a258885d-cde2-40d4-9afb-9a6554ccef27, runId =
     Oc7fa857-60bf-455c-b9c8-cedebea52a49] terminated with error
     java.lang.NoClassDefFoundError: org/apache/kafka/clients/admin/OffsetSpec
             at org.apache.spark.sql.kafka010.KafkaOffsetReaderAdmin.$anonfun$fetchEa
     rliestOffsets$2(KafkaOffsetReaderAdmin.scala:289)
     scala.collection.TraversableLike.$anonfun$map$1(TraversableLike.scala:286)
```

```
at scala.collection.Iterator.foreach(Iterator.scala:943)
```

- at scala.collection.Iterator.foreach\$(Iterator.scala:943)
- at scala.collection.AbstractIterator.foreach(Iterator.scala:1431)
- at scala.collection.IterableLike.foreach(IterableLike.scala:74)
- at scala.collection.IterableLike.foreach\$(IterableLike.scala:73)
- at scala.collection.AbstractIterable.foreach(Iterable.scala:56)
- at scala.collection.TraversableLike.map(TraversableLike.scala:286)
- at scala.collection.TraversableLike.map\$(TraversableLike.scala:279)
- at scala.collection.mutable.AbstractSet.scala\$collection\$SetLike\$\$super\$
 map(Set.scala:50)
 - at scala.collection.SetLike.map(SetLike.scala:105)
 - at scala.collection.SetLike.map\$(SetLike.scala:105)
 - at scala.collection.mutable.AbstractSet.map(Set.scala:50)
- at org.apache.spark.sql.kafka010.Kafka0ffsetReaderAdmin.\$anonfun\$fetchEarliestOffsets\$1(Kafka0ffsetReaderAdmin.scala:289)
- at org.apache.spark.sql.kafka010.Kafka0ffsetReaderAdmin.\$anonfun\$partitionsAssignedToAdmin\$1(KafkaOffsetReaderAdmin.scala:501)
- at org.apache.spark.sql.kafka010.Kafka0ffsetReaderAdmin.withRetries(Kafka0ffsetReaderAdmin.scala:518)
- at org.apache.spark.sql.kafka010.Kafka0ffsetReaderAdmin.partitionsAssign edToAdmin(Kafka0ffsetReaderAdmin.scala:498)
- at org.apache.spark.sql.kafka010.Kafka0ffsetReaderAdmin.fetchEarliestOffsets(Kafka0ffsetReaderAdmin.scala:288)
- at org.apache.spark.sql.kafka010.KafkaMicroBatchStream.\$anonfun\$getOrCre ateInitialPartitionOffsets\$1(KafkaMicroBatchStream.scala:249)
 - at scala.Option.getOrElse(Option.scala:189)
- at org.apache.spark.sql.kafka010.KafkaMicroBatchStream.getOrCreateInitialPartitionOffsets(KafkaMicroBatchStream.scala:246)
- at org.apache.spark.sql.kafka010.KafkaMicroBatchStream.initialOffset(KafkaMicroBatchStream.scala:98)
- at org.apache.spark.sql.execution.streaming.MicroBatchExecution.\$anonfun \$getStartOffset\$2(MicroBatchExecution.scala:455)
 - at scala.Option.getOrElse(Option.scala:189)
- at org.apache.spark.sql.execution.streaming.MicroBatchExecution.getStart Offset(MicroBatchExecution.scala:455)
- at org.apache.spark.sql.execution.streaming.MicroBatchExecution.\$anonfun \$constructNextBatch\$4(MicroBatchExecution.scala:489)
- at org.apache.spark.sql.execution.streaming.ProgressReporter.reportTimeTaken(ProgressReporter.scala:411)
- at org.apache.spark.sql.execution.streaming.ProgressReporter.reportTimeTaken\$(ProgressReporter.scala:409)
- at org.apache.spark.sql.execution.streaming.StreamExecution.reportTimeTa ken(StreamExecution.scala:67)
- at org.apache.spark.sql.execution.streaming.MicroBatchExecution.\$anonfun \$constructNextBatch\$2(MicroBatchExecution.scala:488)

at

 $\verb|scala.collection.TraversableLike.\$anonfun\$map\$1(TraversableLike.scala:286)|$

at scala.collection.Iterator.foreach(Iterator.scala:943)

```
at scala.collection.AbstractIterator.foreach(Iterator.scala:1431)
        at scala.collection.IterableLike.foreach(IterableLike.scala:74)
        at scala.collection.IterableLike.foreach$(IterableLike.scala:73)
        at scala.collection.AbstractIterable.foreach(Iterable.scala:56)
        at scala.collection.TraversableLike.map(TraversableLike.scala:286)
        at scala.collection.TraversableLike.map$(TraversableLike.scala:279)
        at scala.collection.AbstractTraversable.map(Traversable.scala:108)
        at org.apache.spark.sql.execution.streaming.MicroBatchExecution.$anonfun
$constructNextBatch$1(MicroBatchExecution.scala:477)
scala.runtime.java8.JFunction0$mcZ$sp.apply(JFunction0$mcZ$sp.java:23)
        at org.apache.spark.sql.execution.streaming.MicroBatchExecution.withProg
ressLocked(MicroBatchExecution.scala:802)
        at org.apache.spark.sql.execution.streaming.MicroBatchExecution.construc
tNextBatch(MicroBatchExecution.scala:473)
        at org.apache.spark.sql.execution.streaming.MicroBatchExecution.$anonfun
$runActivatedStream$2(MicroBatchExecution.scala:266)
scala.runtime.java8.JFunction0$mcV$sp.apply(JFunction0$mcV$sp.java:23)
        at org.apache.spark.sql.execution.streaming.ProgressReporter.reportTimeT
aken(ProgressReporter.scala:411)
        at org.apache.spark.sql.execution.streaming.ProgressReporter.reportTimeT
aken$(ProgressReporter.scala:409)
        at org.apache.spark.sql.execution.streaming.StreamExecution.reportTimeTa
ken(StreamExecution.scala:67)
        at org.apache.spark.sql.execution.streaming.MicroBatchExecution.$anonfun
$runActivatedStream$1(MicroBatchExecution.scala:247)
        at org.apache.spark.sql.execution.streaming.ProcessingTimeExecutor.execu
te(TriggerExecutor.scala:67)
        at org.apache.spark.sql.execution.streaming.MicroBatchExecution.runActiv
atedStream(MicroBatchExecution.scala:237)
        at org.apache.spark.sql.execution.streaming.StreamExecution.$anonfun$run
Stream$1(StreamExecution.scala:306)
scala.runtime.java8.JFunction0$mcV$sp.apply(JFunction0$mcV$sp.java:23)
        at org.apache.spark.sql.SparkSession.withActive(SparkSession.scala:827)
        at org.apache.spark.sql.execution.streaming.StreamExecution.org$apache$s
park$sql$execution$streaming$StreamExecution$$runStream(StreamExecution.scala:28
4)
        at org.apache.spark.sql.execution.streaming.StreamExecution$$anon$1.run(
StreamExecution.scala:207)
Caused by: java.lang.ClassNotFoundException:
org.apache.kafka.clients.admin.OffsetSpec
        ... 58 more
Exception in thread "stream execution thread for [id =
a258885d-cde2-40d4-9afb-9a6554ccef27, runId =
Oc7fa857-60bf-455c-b9c8-cedebea52a49]" java.lang.NoClassDefFoundError:
```

at scala.collection.Iterator.foreach\$(Iterator.scala:943)

org/apache/kafka/clients/admin/OffsetSpec

at org.apache.spark.sql.kafka010.Kafka0ffsetReaderAdmin.\$anonfun\$fetchEarliestOffsets\$2(Kafka0ffsetReaderAdmin.scala:289)

at

scala.collection.TraversableLike.\$anonfun\$map\$1(TraversableLike.scala:286)

- at scala.collection.Iterator.foreach(Iterator.scala:943)
- at scala.collection.Iterator.foreach\$(Iterator.scala:943)
- at scala.collection.AbstractIterator.foreach(Iterator.scala:1431)
- at scala.collection.IterableLike.foreach(IterableLike.scala:74)
- at scala.collection.IterableLike.foreach\$(IterableLike.scala:73)
- at scala.collection.AbstractIterable.foreach(Iterable.scala:56)
- at scala.collection.TraversableLike.map(TraversableLike.scala:286)
- at scala.collection.TraversableLike.map\$(TraversableLike.scala:279)
- at scala.collection.mutable.AbstractSet.scala\$collection\$SetLike\$\$super\$
 map(Set.scala:50)
 - at scala.collection.SetLike.map(SetLike.scala:105)
 - at scala.collection.SetLike.map\$(SetLike.scala:105)
 - at scala.collection.mutable.AbstractSet.map(Set.scala:50)
- at org.apache.spark.sql.kafka010.Kafka0ffsetReaderAdmin.\$anonfun\$fetchEarliestOffset\$1(Kafka0ffsetReaderAdmin.scala:289)
- at org.apache.spark.sql.kafka010.Kafka0ffsetReaderAdmin.\$anonfun\$partitionsAssignedToAdmin\$1(Kafka0ffsetReaderAdmin.scala:501)
- at org.apache.spark.sql.kafka010.Kafka0ffsetReaderAdmin.withRetries(Kafka0ffsetReaderAdmin.scala:518)
- at org.apache.spark.sql.kafka010.Kafka0ffsetReaderAdmin.partitionsAssign edToAdmin(Kafka0ffsetReaderAdmin.scala:498)
- at org.apache.spark.sql.kafka010.Kafka0ffsetReaderAdmin.fetchEarliestOffsets(Kafka0ffsetReaderAdmin.scala:288)
- at org.apache.spark.sql.kafka010.KafkaMicroBatchStream.\$anonfun\$getOrCre ateInitialPartitionOffsets\$1(KafkaMicroBatchStream.scala:249)
 - at scala.Option.getOrElse(Option.scala:189)
- at org.apache.spark.sql.kafka010.KafkaMicroBatchStream.getOrCreateInitialPartitionOffsets(KafkaMicroBatchStream.scala:246)
- at org.apache.spark.sql.kafka010.KafkaMicroBatchStream.initialOffset(KafkaMicroBatchStream.scala:98)
- at org.apache.spark.sql.execution.streaming.MicroBatchExecution.\$anonfun \$getStartOffset\$2(MicroBatchExecution.scala:455)
 - at scala.Option.getOrElse(Option.scala:189)
- at org.apache.spark.sql.execution.streaming.MicroBatchExecution.getStart Offset(MicroBatchExecution.scala:455)
- at org.apache.spark.sql.execution.streaming.MicroBatchExecution.\$anonfun \$constructNextBatch\$4(MicroBatchExecution.scala:489)
- at org.apache.spark.sql.execution.streaming.ProgressReporter.reportTimeTaken(ProgressReporter.scala:411)
- at org.apache.spark.sql.execution.streaming.ProgressReporter.reportTimeT aken\$(ProgressReporter.scala:409)
- at org.apache.spark.sql.execution.streaming.StreamExecution.reportTimeTa ken(StreamExecution.scala:67)

```
at org.apache.spark.sql.execution.streaming.MicroBatchExecution.$anonfun
$constructNextBatch$2(MicroBatchExecution.scala:488)
scala.collection.TraversableLike.$anonfun$map$1(TraversableLike.scala:286)
        at scala.collection.Iterator.foreach(Iterator.scala:943)
        at scala.collection.Iterator.foreach$(Iterator.scala:943)
        at scala.collection.AbstractIterator.foreach(Iterator.scala:1431)
        at scala.collection.IterableLike.foreach(IterableLike.scala:74)
        at scala.collection.IterableLike.foreach$(IterableLike.scala:73)
        at scala.collection.AbstractIterable.foreach(Iterable.scala:56)
        at scala.collection.TraversableLike.map(TraversableLike.scala:286)
        at scala.collection.TraversableLike.map$(TraversableLike.scala:279)
        at scala.collection.AbstractTraversable.map(Traversable.scala:108)
        at org.apache.spark.sql.execution.streaming.MicroBatchExecution.$anonfun
$constructNextBatch$1(MicroBatchExecution.scala:477)
scala.runtime.java8.JFunction0$mcZ$sp.apply(JFunction0$mcZ$sp.java:23)
        at org.apache.spark.sql.execution.streaming.MicroBatchExecution.withProg
ressLocked(MicroBatchExecution.scala:802)
        at org.apache.spark.sql.execution.streaming.MicroBatchExecution.construc
tNextBatch(MicroBatchExecution.scala:473)
        at org.apache.spark.sql.execution.streaming.MicroBatchExecution.$anonfun
$runActivatedStream$2(MicroBatchExecution.scala:266)
scala.runtime.java8.JFunction0$mcV$sp.apply(JFunction0$mcV$sp.java:23)
        at org.apache.spark.sql.execution.streaming.ProgressReporter.reportTimeT
aken(ProgressReporter.scala:411)
        at org.apache.spark.sql.execution.streaming.ProgressReporter.reportTimeT
aken$(ProgressReporter.scala:409)
        at org.apache.spark.sql.execution.streaming.StreamExecution.reportTimeTa
ken(StreamExecution.scala:67)
        at org.apache.spark.sql.execution.streaming.MicroBatchExecution.$anonfun
$runActivatedStream$1(MicroBatchExecution.scala:247)
        at org.apache.spark.sql.execution.streaming.ProcessingTimeExecutor.execu
te(TriggerExecutor.scala:67)
        at org.apache.spark.sql.execution.streaming.MicroBatchExecution.runActiv
atedStream(MicroBatchExecution.scala:237)
        at org.apache.spark.sql.execution.streaming.StreamExecution.$anonfun$run
Stream$1(StreamExecution.scala:306)
scala.runtime.java8.JFunction0$mcV$sp.apply(JFunction0$mcV$sp.java:23)
        at org.apache.spark.sql.SparkSession.withActive(SparkSession.scala:827)
        at org.apache.spark.sql.execution.streaming.StreamExecution.org$apache$s
park$sql$execution$streaming$StreamExecution$$runStream(StreamExecution.scala:28
```

at org.apache.spark.sql.execution.streaming.StreamExecution\$\$anon\$1.run(StreamExecution.scala:207)

Caused by: java.lang.ClassNotFoundException:

```
StreamingQueryException
                                          Traceback (most recent call last)
Cell In[25], line 24
      2 ds_joined = df_joined \
          .withColumn(
     4
            'value'.
   (...)
          .option("checkpointLocation", str(joined_checkpoint_dir)) \
     21
          .start()
     23 try:
---> 24
            ds_joined.awaitTermination()
     25 except KeyboardInterrupt:
            print("STOPPING STREAMING DATA")
File /opt/conda/lib/python3.10/site-packages/pyspark/sql/streaming/query.py:201
 →in StreamingQuery.awaitTermination(self, timeout)
    199
            return self._jsq.awaitTermination(int(timeout * 1000))
    200 else:
            return self._jsq.awaitTermination()
--> 201
File /opt/conda/lib/python3.10/site-packages/py4j/java gateway.py:1322, in_

→JavaMember.__call__(self, *args)
   1316 command = proto.CALL_COMMAND_NAME +\
   1317
            self.command_header +\
            args command +\
   1318
   1319
           proto.END_COMMAND_PART
   1321 answer = self.gateway client.send command(command)
-> 1322 return value = get return value(
            answer, self.gateway_client, self.target_id, self.name)
   1325 for temp_arg in temp_args:
   1326
            if hasattr(temp_arg, "_detach"):
File /opt/conda/lib/python3.10/site-packages/pyspark/errors/exceptions/captured
 ⇔py:175, in capture_sql_exception.<locals>.deco(*a, **kw)
    171 converted = convert_exception(e.java_exception)
    172 if not isinstance(converted, UnknownException):
            # Hide where the exception came from that shows a non-Pythonic
            # JVM exception message.
    174
--> 175
           raise converted from None
    176 else:
    177 raise
```

```
StreamingQueryException: [STREAM_FAILED] Query [id =_
a258885d-cde2-40d4-9afb-9a6554ccef27, runId =_
00c7fa857-60bf-455c-b9c8-cedebea52a49] terminated with exception: org/apache/
kafka/clients/admin/OffsetSpec
```

```
[26]: print(ds_joined)
```

<pyspark.sql.streaming.query.StreamingQuery object at 0x7fca24e86650>

```
[27]: print(type(ds_joined))
```

<class 'pyspark.sql.streaming.query.StreamingQuery'>