Assignment 9.2

May 13, 2023

0.1 Assignment 9.2

```
[1]: import os
    import shutil
    import json
    from pathlib import Path
    import pandas as pd
    import time
    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
    from pyspark.sql.types import StringType, TimestampType, DoubleType,
      →StructField, StructType
    from pyspark.sql.functions import udf, window, mean, from_json, col
    current_dir = Path(os.getcwd()).absolute()
    checkpoint_dir = current_dir.joinpath('checkpoints')
    locations_windowed_checkpoint_dir = checkpoint_dir.
      if locations_windowed_checkpoint_dir.exists():
        shutil.rmtree(locations_windowed_checkpoint_dir)
    locations_windowed_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['windowed_topic'] = '{}-windowed'.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('windowed')
```

Topic "MeyerJake-windowed" 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.

```
[15]: 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()
      ## 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()
```

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.

```
[16]: 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('y', 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)
```

See http://spark.apache.org/docs/latest/structured-streaming-programming-guide.html#window-operations-on-event-time for details on how to implement windowed operations.

The following code selects the timestamp column from the df_locations dataframe that reads from the LastnameFirstname-locations topic and parses the binary value using the udf_parse_location UDF and defines the result to the json_value column.

```
df_locations \
    .select(
      col('timestamp'),
      udf_parse_location(df_locations['value']).alias('json_value')
)
```

From here, you can select data from the json_value column using the select method. For instance, if you saved the results of the previous code snippet to df_locations_parsed you could select columns from the json_value field and assign them aliases using the following code.

```
df_locations_parsed.select(
    col('timestamp'),
```

```
col('json_value.ride_id').alias('ride_id'),
col('json_value.uuid').alias('uuid'),
col('json_value.speed').alias('speed')
)
```

Next, you will want to add a watermark and group by ride_id and speed using a window duration of 30 seconds and a slide duration of 15 seconds. Use the withWatermark method in conjunction with the groupBy method. The Spark streaming documentation should provide examples of how to do this.

Next use the mean aggregation method to compute the average values and rename the column avg(speed) to value and the column ride_id to key. The reason you are renaming these values is that the PySpark Kafka API expects key and value as inputs. In a production example, you would setup serialization that would handle these details for you.

When you are finished, you should have a streaming query with key and value as columns.

```
[17]: ## Run the code from the previous cell for df_locations_parsed.
df_locations_parsed = df_locations \
    .select(
        col('timestamp'),
        udf_parse_location(df_locations['value']).alias('json_value')
    )
    print(df_locations_parsed)
```

DataFrame[timestamp: timestamp, json_value: struct<offset:double,id:string,ride_
id:string,uuid:string,course:double,latitude:double,longitude:double,geohash:str
ing,speed:double,accuracy:double>]

```
[18]: print(df_locations_parsed.printSchema())
```

None

[19]: ## Run the code from the previous cell for df_locations_parsed.
df_locations_parsed = df_locations_parsed.select(

```
col('timestamp'),
  col('json_value.ride_id').alias('ride_id'),
  col('json_value.uuid').alias('uuid'),
  col('json_value.speed').alias('speed')
)
print(df_locations_parsed)
```

DataFrame[timestamp: timestamp, ride_id: string, uuid: string, speed: double]

```
[20]: print(df_locations_parsed.printSchema())
```

```
root
|-- timestamp: timestamp (nullable = true)
|-- ride_id: string (nullable = true)
|-- uuid: string (nullable = true)
|-- speed: double (nullable = true)
```

None

[21]: DataFrame[window: struct<start:timestamp,end:timestamp>, ride_id: string, speed: double, value: double, key: double]

In the previous Jupyter cells, you should have created the windowedSpeeds streaming query. Next, you will need to write that to the LastnameFirstname-windowed topic. If you created the windowsSpeeds streaming query correctly, the following should publish the results to the LastnameFirstname-windowed topic.

```
try:
    ds_locations_windowed.awaitTermination()
except KeyboardInterrupt:
    print("STOPPING STREAMING DATA")
23/05/13 13:59:43 WARN ResolveWriteToStream: spark.sql.adaptive.enabled is not
supported in streaming DataFrames/Datasets and will be disabled.
23/05/13 13:59:43 WARN AdminClientConfig: The configuration 'key.deserializer'
was supplied but isn't a known config.
23/05/13 13:59:43 WARN AdminClientConfig: The configuration 'value.deserializer'
was supplied but isn't a known config.
23/05/13 13:59:43 WARN AdminClientConfig: The configuration 'enable.auto.commit'
was supplied but isn't a known config.
23/05/13 13:59:43 WARN AdminClientConfig: The configuration 'max.poll.records'
was supplied but isn't a known config.
23/05/13 13:59:43 WARN AdminClientConfig: The configuration 'auto.offset.reset'
was supplied but isn't a known config.
23/05/13 13:59:43 ERROR MicroBatchExecution: Query [id =
1b938d75-1604-4381-88d0-008663ad0849, runId =
7e649eb0-b4d5-4145-a63f-8e2869be34e2] 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$(SetLike.scala:105)
        at scala.collection.mutable.AbstractSet.map(Set.scala:50)
        at org.apache.spark.sql.kafka010.KafkaOffsetReaderAdmin.$anonfun$fetchEa
rliestOffsets$1(KafkaOffsetReaderAdmin.scala:289)
        at org.apache.spark.sql.kafka010.KafkaOffsetReaderAdmin.$anonfun$partiti
onsAssignedToAdmin$1(KafkaOffsetReaderAdmin.scala:501)
        at org.apache.spark.sql.kafka010.KafkaOffsetReaderAdmin.withRetries(Kafk
aOffsetReaderAdmin.scala:518)
        at org.apache.spark.sql.kafka010.Kafka0ffsetReaderAdmin.partitionsAssign
```

edToAdmin(KafkaOffsetReaderAdmin.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

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

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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)

at

scala.runtime.java8.JFunction0\$mcZ\$sp.apply(JFunction0\$mcZ\$sp.java:23)

at org.apache.spark.sql.execution.streaming.MicroBatchExecution.withProgressLocked(MicroBatchExecution.scala:802)

at org.apache.spark.sql.execution.streaming.MicroBatchExecution.constructNextBatch(MicroBatchExecution.scala:473)

at org.apache.spark.sql.execution.streaming.MicroBatchExecution.\$anonfun \$runActivatedStream\$2(MicroBatchExecution.scala:266)

at

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```
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        at org.apache.spark.sql.execution.streaming.ProcessingTimeExecutor.execu
te(TriggerExecutor.scala:67)
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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$1.run(
StreamExecution.scala:207)
Caused by: java.lang.ClassNotFoundException:
org.apache.kafka.clients.admin.OffsetSpec
        ... 58 more
Exception in thread "stream execution thread for [id =
1b938d75-1604-4381-88d0-008663ad0849, runId =
7e649eb0-b4d5-4145-a63f-8e2869be34e2]" java.lang.NoClassDefFoundError:
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        at org.apache.spark.sql.execution.streaming.ProcessingTimeExecutor.execu
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        at org.apache.spark.sql.execution.streaming.StreamExecution.$anonfun$run
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        at org.apache.spark.sql.SparkSession.withActive(SparkSession.scala:827)
        at org.apache.spark.sql.execution.streaming.StreamExecution.org$apache$s
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        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
```

```
StreamingQueryException
                                          Traceback (most recent call last)
Cell In[22], line 12
      1 ds_locations_windowed = windowedSpeeds \
         .selectExpr("CAST(key AS STRING)", "CAST(value AS STRING)") \
      3
        .writeStream \
   (...)
         .option("checkpointLocation", str(locations_windowed_checkpoint_dir)) \
          .start()
     11 try:
            ds_locations_windowed.awaitTermination()
---> 12
     13 except KeyboardInterrupt:
            print("STOPPING STREAMING DATA")
     14
File /opt/conda/lib/python3.10/site-packages/pyspark/sql/streaming/query.py:201
 →in StreamingQuery.awaitTermination(self, timeout)
            return self._jsq.awaitTermination(int(timeout * 1000))
```

```
200 else:
      --> 201
                 return self._jsq.awaitTermination()
      File /opt/conda/lib/python3.10/site-packages/py4j/java_gateway.py:1322, in_u
       →JavaMember. call (self, *args)
         1316 command = proto.CALL COMMAND NAME +\
                 self.command header +\
         1318
                 args command +\
         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):
          173
                 # Hide where the exception came from that shows a non-Pythonic
          174
                 # JVM exception message.
                 raise converted from None
      --> 175
          176 else:
          177
                 raise
      StreamingQueryException: [STREAM_FAILED] Query [id =__
       ⇔kafka/clients/admin/OffsetSpec
[23]: print(ds_locations_windowed)
     <pyspark.sql.streaming.query.StreamingQuery object at 0x7fd39b82db40>
[24]: print(type(ds_locations_windowed))
```

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