# 15-319 / 15-619 Cloud Computing

Recitation 14 November 26<sup>th</sup> 2019

### Overview

- Last week's reflection
  - Team Project Phase 3 Live Test
- This week's schedule
  - Phase 3 report
    - Deadline **TODAY** Nov 26, 23:59:00 ET
  - Project 4.3
    - Deadline FRIDAY Dec 6, 23:59:59 ET
  - Project 4.3 Reflection Feedback
    - Deadline **SUNDAY** Dec 8, 23:59:59 ET
  - Course survey (2% bonus!)
    - Deadline Saturday Dec 6, 23:59:59 ET

# Project 4

#### • Project 4.1

- Iterative Programming Using Apache Spark

#### • Project 4.2

- Machine Learning on the Cloud

#### • Project 4.3



- Stream Processing using Kafka & Samza

### Stream vs Batch Processing

- Batch processing
  - Data parallel, graph parallel
  - Iterative, non-iterative
  - Runs once in few hours/days
  - Historical data analysis
  - Not well suited for real time events streams
- Stream processing
  - Process events as they come
  - Real time decision making
  - Sensor streams/web event data

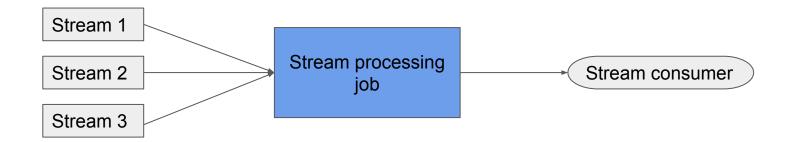
# Typical batch processing job

- Input is collected into batches and processing is done on the input data
- Output is consumed later at any point of time the data does not lose much of its "value" with time



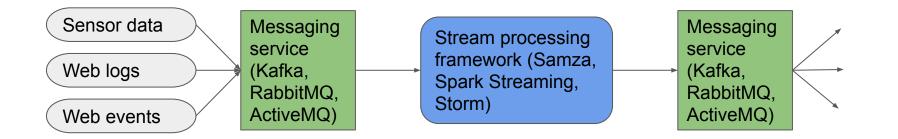
# Typical stream processing job

- Data is processed immediately (few seconds)
- The processed data is used by downstream consumers for real time decision/analytics immediately



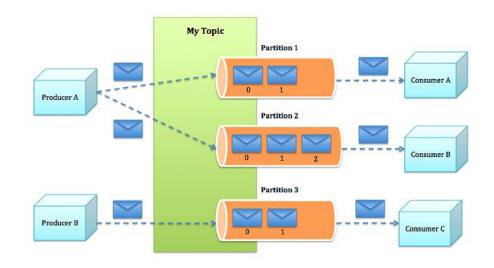
#### Typical stream processing components

- An event producer <u>Sensors</u>, web logs, web events
- A messaging service <u>Kafka</u>, RabbitMQ, ActiveMQ
- A stream processing framework <u>Samza</u>, Storm, Spark Streaming



#### Apache Kafka

• A distributed messaging system developed at LinkedIn.

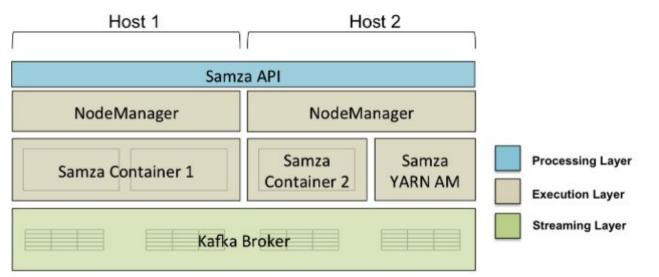


## Semantic partitioning in Kafka

- Each topic (stream) is partitioned for scalability across all nodes in the Kafka cluster
- Default partitioning attempts to load balance the messages
- Streams can also be partitioned semantically by user key of the message
- All messages with the same key arrive to the same partition
- Fault-tolerance: Replication
  - One leader and zero/more followers
  - Replication factor
  - ISR (in-sync replicas)

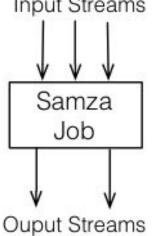
#### Apache Samza

- Stream processing framework developed at LinkedIn
- Consists of 3 layers:
  - streaming, execution and processing (Samza) layer
- Most common use: Kafka for streaming, YARN for execution



#### Apache Samza

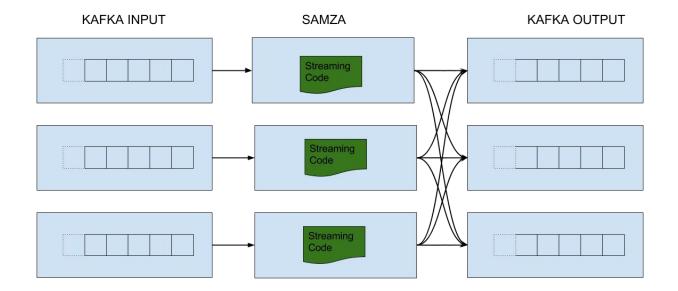
- Programmer uses the Samza API to perform stream processing
- Each partition in Kafka is assigned to a <u>single</u> Samza task instance
   Input Streams



#### Stateful stream processing in Apache Samza

- Calculate sum, avg, count, etc.
- State in remote data store? slow
- State in local memory? machine might crash
- Solution persistent KV store provided by Samza
  - Changes to KV store persisted to a different stream (usually Kafka) - replay on failure
  - RocksDB currently supported as a persistent
    KV store
    - You MUST use a persistent KV store for P4.3!

### Putting Kafka and Samza Together



### Project 4.3-Three Tasks

- Use Kafka to produce streams and use Samza to join the streams and output client-driver match like Uber.
- Test cases are provided for the all the tasks. Your solution should pass the provided test cases.

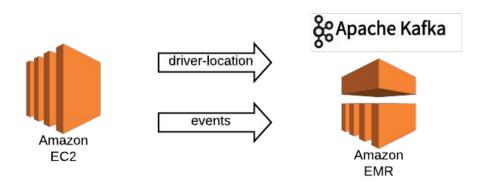
Task 1	Kafka producer API, Tracefile		
Task 2	Samza API, Client-driver Match		
Task 3	Samza API, Advertisement-rider match		
Bonus Task	Samza API, Enhanced ad-recommendation service		

- Simulate the scenario that the **drivers** update their locations on a regular basis as they move in the city and the **clients** request rides at some time.
  - o Data
    - Tracefile -> Two streams
    - Type:
      - DRIVER\_LOCATION

-> driver\_locations stream

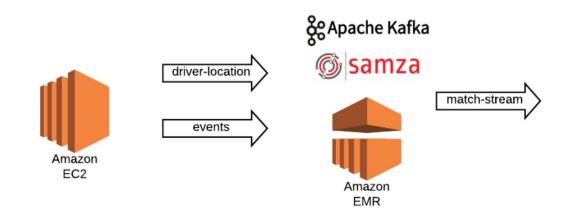
- LEAVING\_BLOCK, ENTERING\_BLOCK, RIDE\_REQUEST, RIDE\_COMPLETE
  - -> events stream

- Task 1
  - You will run your producer program on your AMI instance.
  - The producer program will publish the data into Kafka brokers.
  - The submitter for Task 1 is located on the AMI instance.



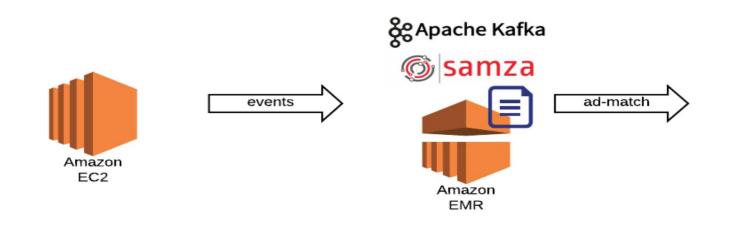
#### • Task 2

- Use the same producer program used in Task 1.
- You need to find the best match of a ride request with a driver located in the same block as the rider based on published data.



#### • Task 3

- You need to find the best advertisement to place for a specific user.
- You need to utilize static data(user profile, health status and interests) and stream data to make this decision.



### Hints for Task 2 & Task 3

You need to:

- Change the Network Address in config/\*.properties files, and \*TaskApplication.java files. The Network Address is given when you deploy Samza to your cluster.
- 2. Configure the low level Task Application in **\*TaskApplication.java** files:
  - a. Create inputDescriptor and outputDescriptor
  - b. Attach systemDescriptor in taskApplicationDescriptor
  - c. <u>Attach</u> inputDescriptor and outputDescriptor in taskApplicationDescriptor
- 3. Make sure that you **do not overwrite** the tracefile when copying your code files to the workspace instance or the EMR cluster.

# Project 4.3 - Debugging

#### • Debugging (IMPORTANT!)

- Use the YARN UI
- Output a kafka stream for debugging
- Yarn application commands
  - yarn application -list
- YARN container logs
  - on the machine where the YARN container is running
- Read the debugging section in the write-up carefully!
- Include the error message when you post on Piazza!

#### Project 4.3 - Bonus Task

- Bonus task Advanced Ad Matching.
- Change your ad match rule as described in the writeup.
- <u>**Task</u>**: Consider the destination direction when you perform ad matching.</u>
- The logic in this bonus task will be manually graded, so make sure that you submit your code.

# P4.3 Grading

- Skeleton code also provides the submitters
- Follow the instructions in the submitter
  - Prompts for starting the Kafka Producer and Samza job
- We will look for the usage of KV stores and reasonably efficient and well-tested code
  - Do not iterate through ALL drivers or businesses to find the best match!

# TEAM PROJECT Twitter Data Analytics



#### Team Project Time Table



Phase (and query due)	Start	Deadlines	Code and Report Due
Phase 1 • Q1, Q2	Monday 10/07/2019 00:00:00 ET	Checkpoint 1, Report: Sunday 10/13/2019 23:59:59 ET Checkpoint 2, Q1: Sunday 10/20/2019 23:59:59 ET Phase 1, Q2: Sunday 10/27/2019 23:59:59 ET	Phase 1: Tuesday 10/29/2019 23:59:59 ET
Phase 2 • Q1, Q2,Q3	Monday 10/28/2019 00:00:00 ET	Sunday 11/10/2019 15:59:59 ET	
Phase 2 Live Test (Hbase AND MySQL) • Q1, Q2, Q3	Sunday 11/10/2019 17:00:00 ET	Sunday 11/10/2019 23:59:59 ET	Tuesday 11/12/2019 23:59:59 ET
Phase 3 • Q1, Q2, Q3 (Managed services)	Monday 11/11/2019 00:00:00 ET	Sunday 11/24/2019 15:59:59 ET	
Phase 3 Live Test • Q1, Q2, Q3 (Managed services)	Sunday 11/24/2019 17:00:00 ET	Sunday 11/24/2019 23:59:59 ET	Tuesday 11/26/2019 23:59:59 ET

#### Team Project, Overall Winners

- Attend the **Thursday** (12/5) cupcake party recitation
  - To see the winners of the Team Project
  - To listen to the top teams and their implementations
  - Eat a lot of cupcakes
  - Have fun!

#### **Upcoming Deadlines**

- Team Project Phase 3 report
  - Due: **TODAY 11/26/2019 23:59** PM Pittsburgh
- Project 4.3 : Stream Processing with Kafka/Samza
  - Due: **\*FRIDAY\*** 12/6/2019 11:59 PM Pittsburgh
- Apply for the S20 TA job, there is still time
  - https://forms.gle/3ddaeYqa2d8qNwcs5
- Complete the course survey (to be announced on Piazza)
  - **2% bonus** for the overall course grade (Don't miss it!!!)
- Cupcake Party (GHC 4307 Pittsburgh and SV 109)
  - Thursday 12/5/2018 4:30 PM ET Pittsburgh, 1:30 PM PT SV 26

#### Questions?