



Hops



@hopshadoop



<http://github.com/hopshadoop>



<http://www.hops.io>

# Structured Spark Streaming-as-a-Service with Hopsworks

Jim Dowling

Assoc. Prof, Royal Institute of Technology, Stockholm

# Spark Streaming-as-a-Service in Sweden

- **SICS ICE**

Datacenter research environment

- **Hopsworks**

Spark/Flink/Kafka/Tensorflow-as-a-service

- Built on Hops Hadoop ([www.hops.io](http://www.hops.io))

>150 active users

Swedish National  
Day Today!



RI  
SE

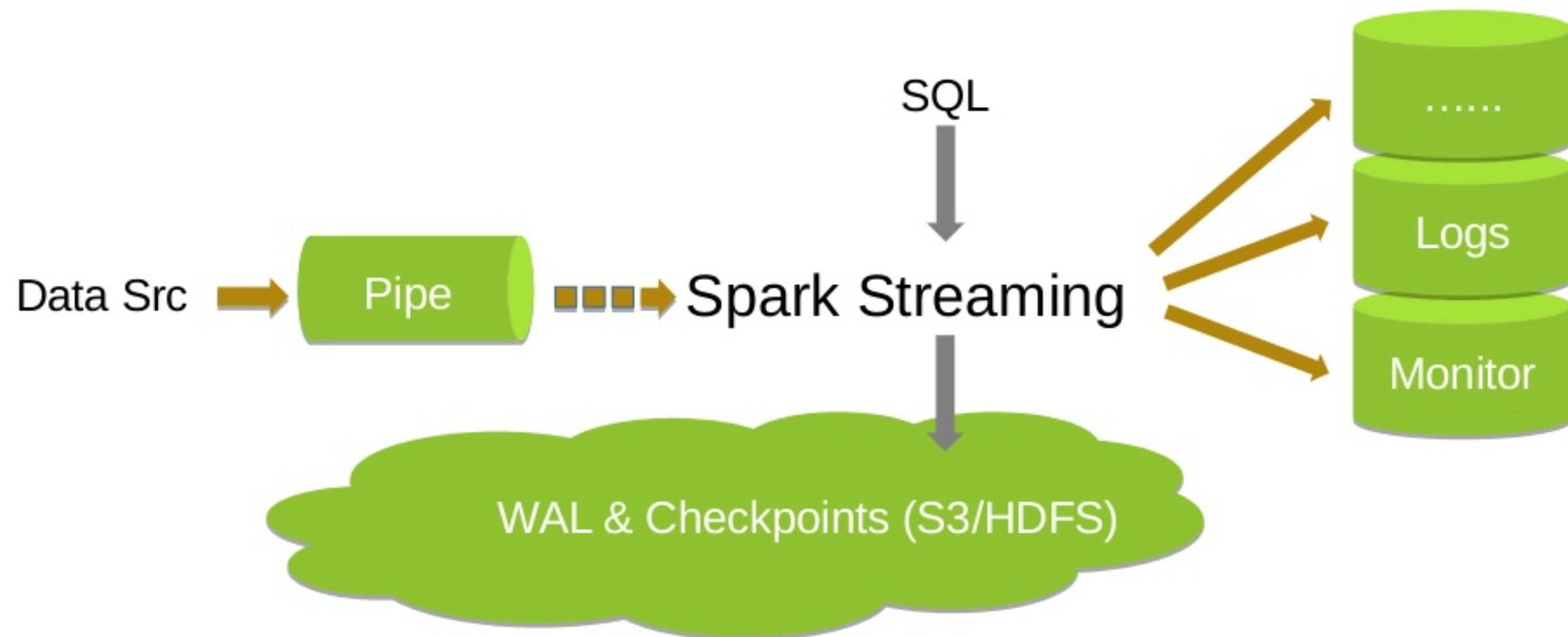


# Self-Service Spark-Streaming

I want to Spark Up,  
all by myself.



# Structured Spark Streaming



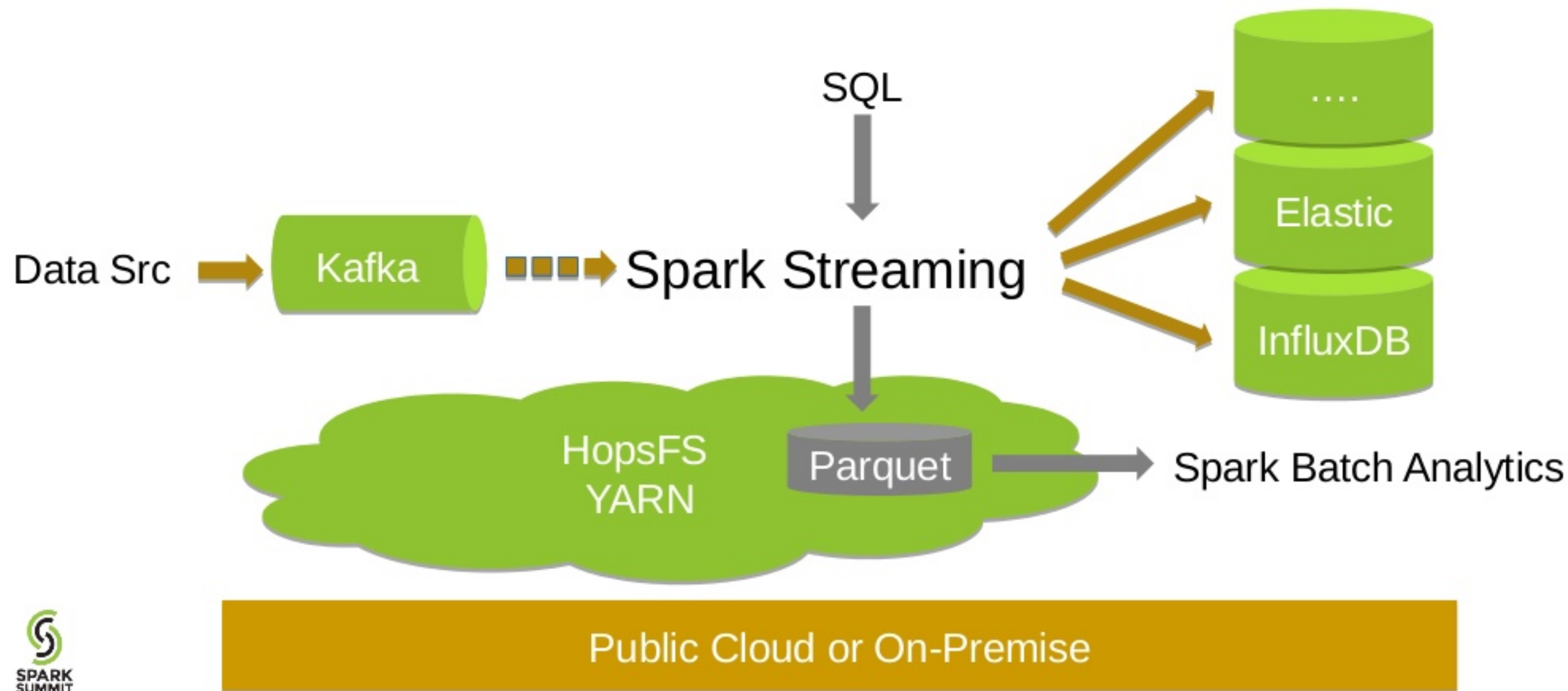


# Smoking Spark Streaming

A pipe for my data: Kafka  
A cloud for my smoke: Hops Hadoop  
A way to roll A/B tests: Jupyter/Zeppelin  
A lookout for trouble: Grafana/Influx  
A log with evidence: ELK Stack



# Structured Spark Streaming (Hops)



# General Data Protection Regulation (GDPR)

## Ostrich Day: 2018-05-25

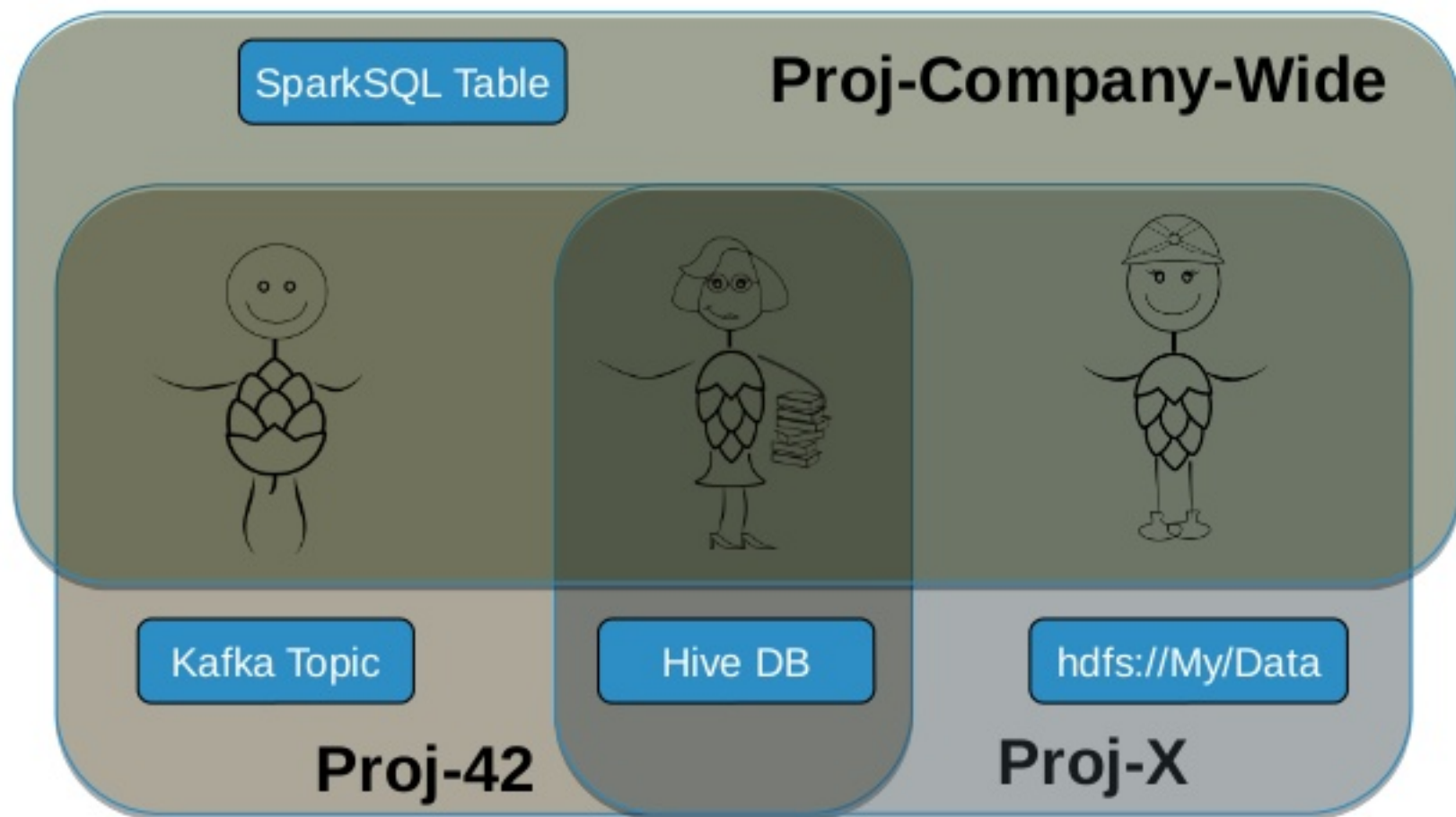


## PRIVACY-BY-DESIGN WITH PROJECTS

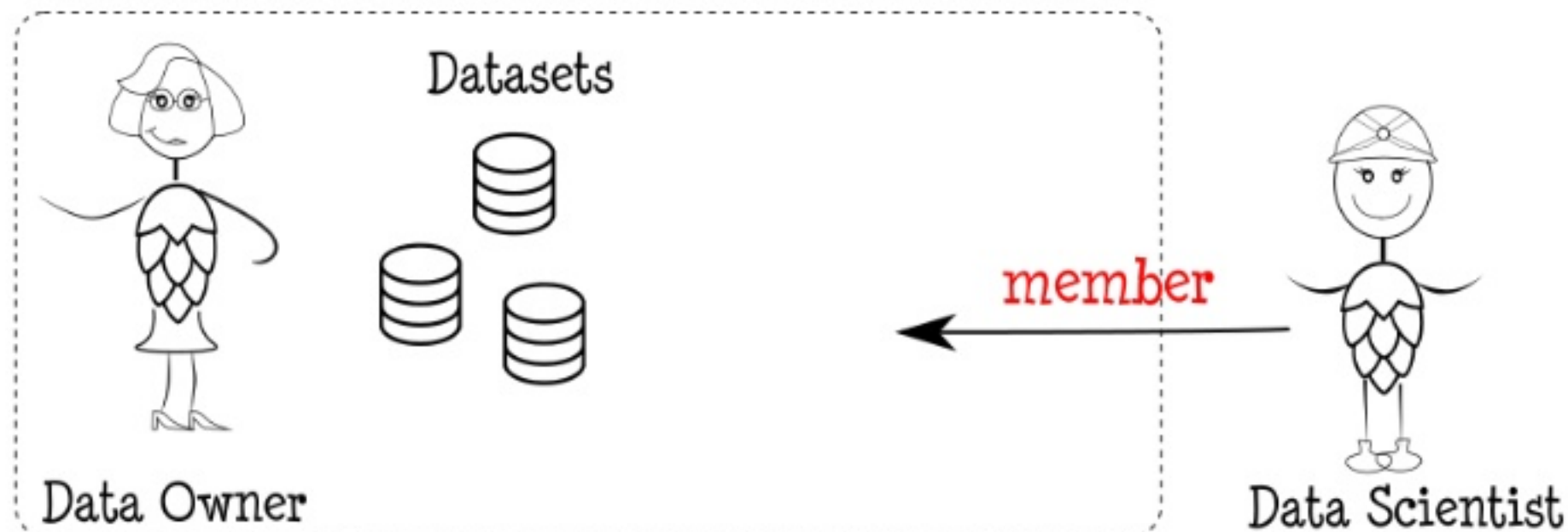


# Projects for Multi-tenancy

A **Project** is a Grouping of **Users** and **Data**



# Manage Projects Like GitHub



# Project Roles

The screenshot shows a 'Members' management window. At the top, there is a search bar labeled 'Find member...' and a '+ New members' button. Below this is a section titled 'Members to be added' containing an 'Add members...' input field. A table below the input field shows a member being added: 'test2@kth.se' with the role 'Data scientist'. A green 'Save' button is at the bottom right of this section. Below the 'Members to be added' section is a table of existing members.

Members	Role	Action
Admin Admin (me) admin@kth.se	Data owner	
Test1 Test1 test1@kth.se	Data scientist	
Test3 Test3 test3@kth.se	Data scientist	

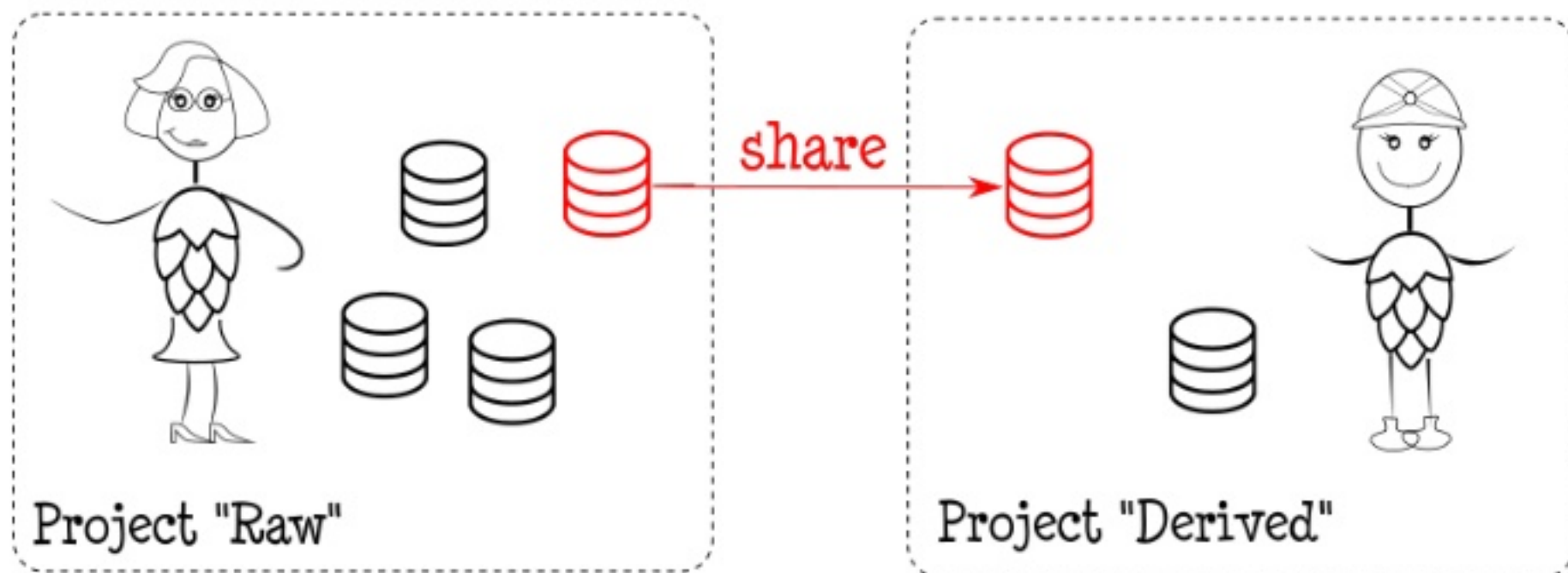
- Data Owner Privileges
  - Import/Export data
  - Manage Membership
  - Share Data/Topics
- Data Scientist Privileges
  - Write and Run code

**We delegate administration of privileges to users**

**EASY SHARING IN A SECURE ENVIRONMENT**

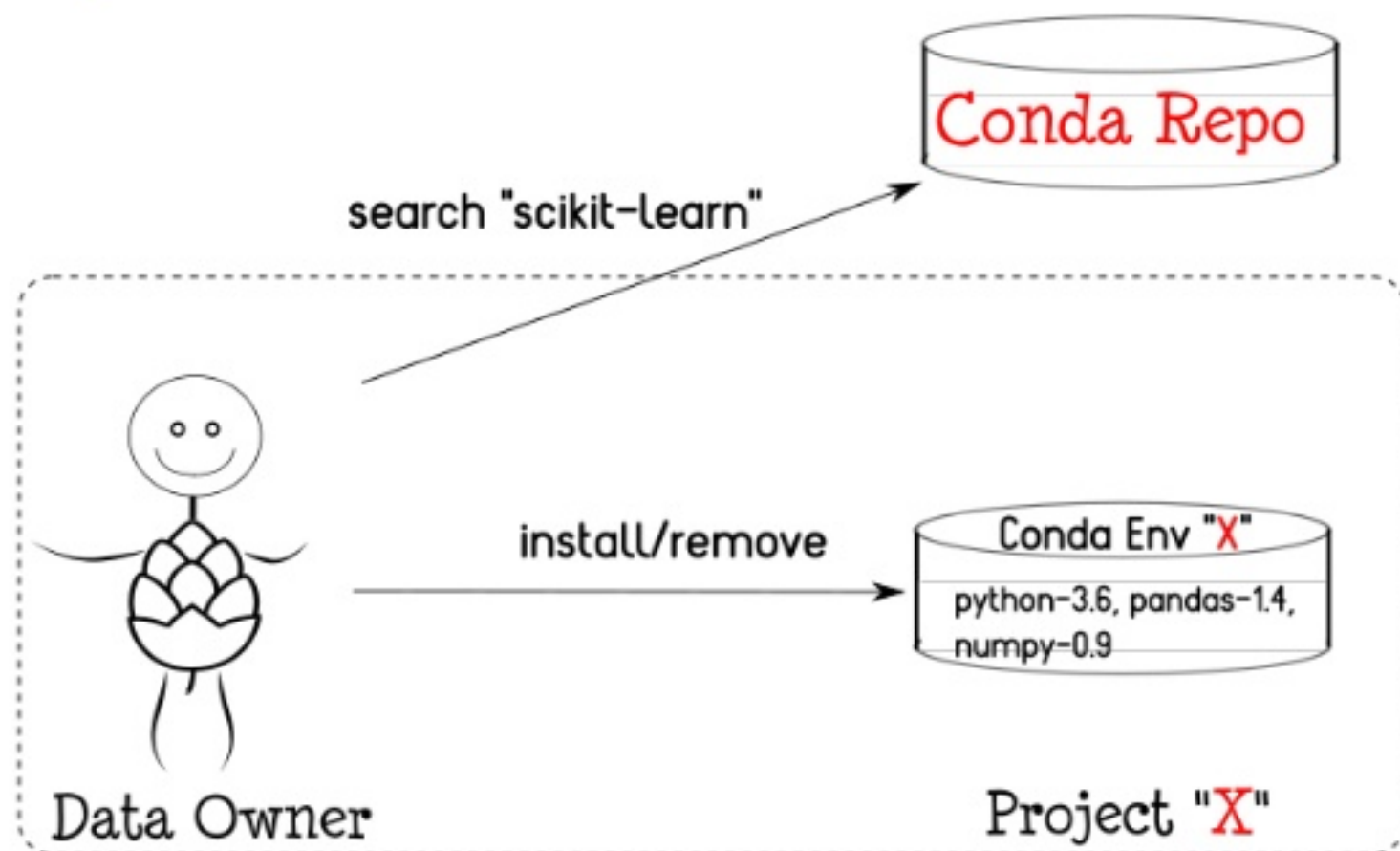


# Share Datasets/Topics like Dropbox



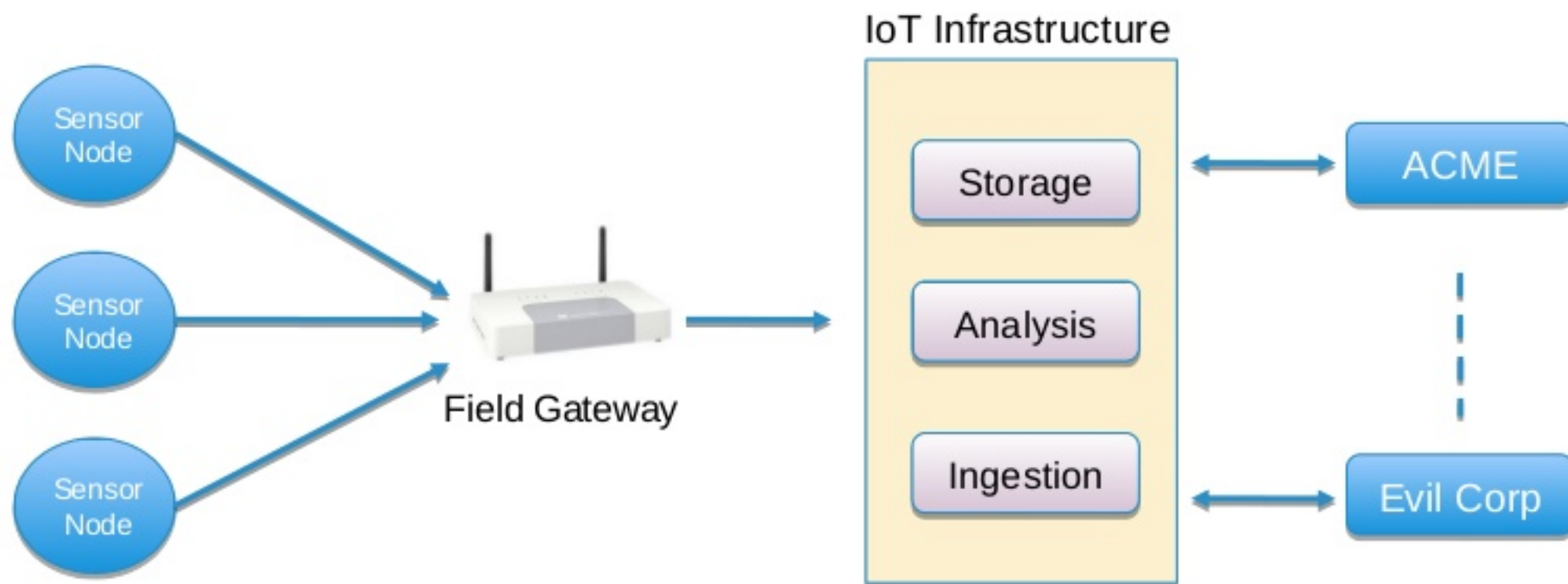
Share any Data Source/Sink: HDFS Datasets, Kafka Topics, etc

# Custom Python Environments with Conda



Python libraries are usable by any framework (Spark/Tensorflow)

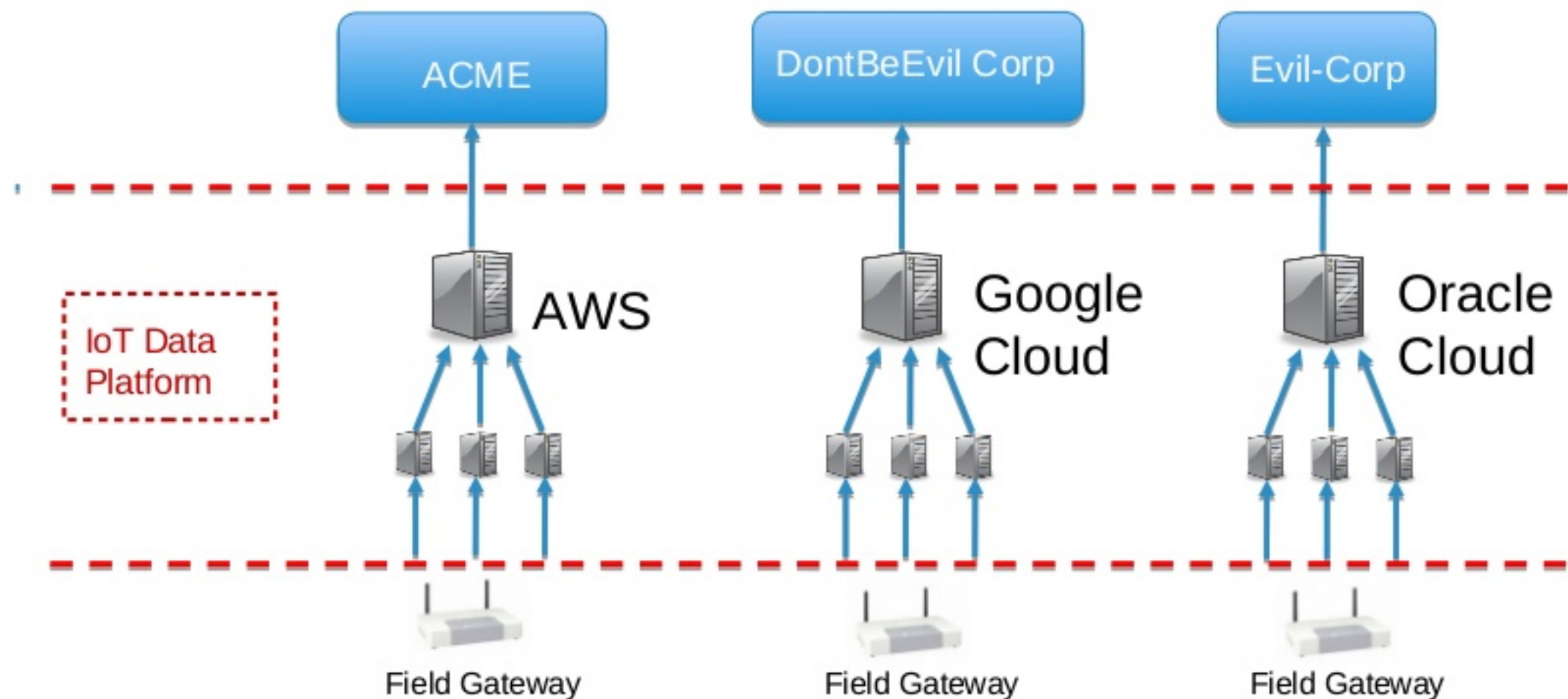
# Case Study: IoT Data Platform



# Multi-Cloud IoT Data Platform



User Apps control IoT Devices



IoT Data  
Platform

AWS

Google  
Cloud

Oracle  
Cloud

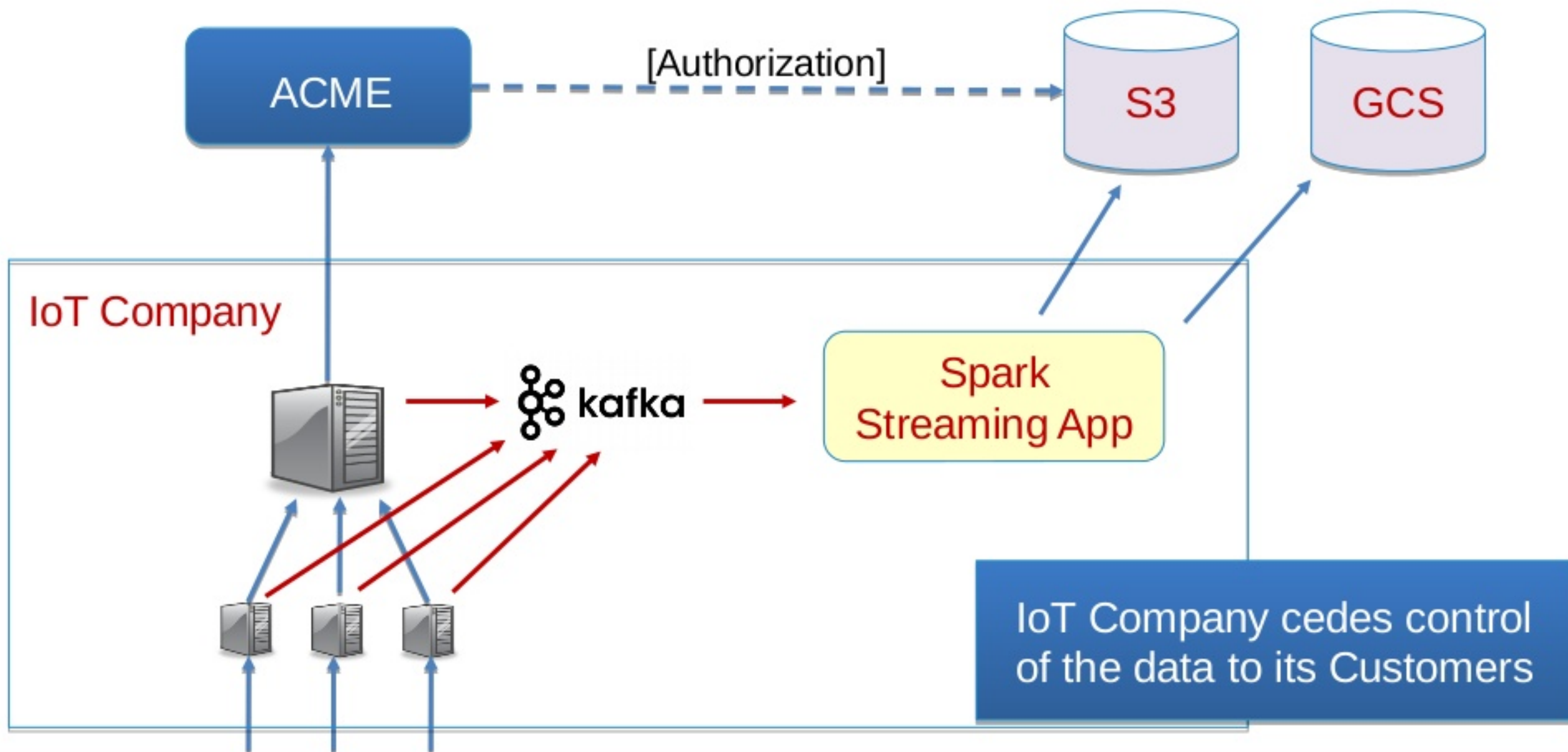
Field Gateway

Field Gateway

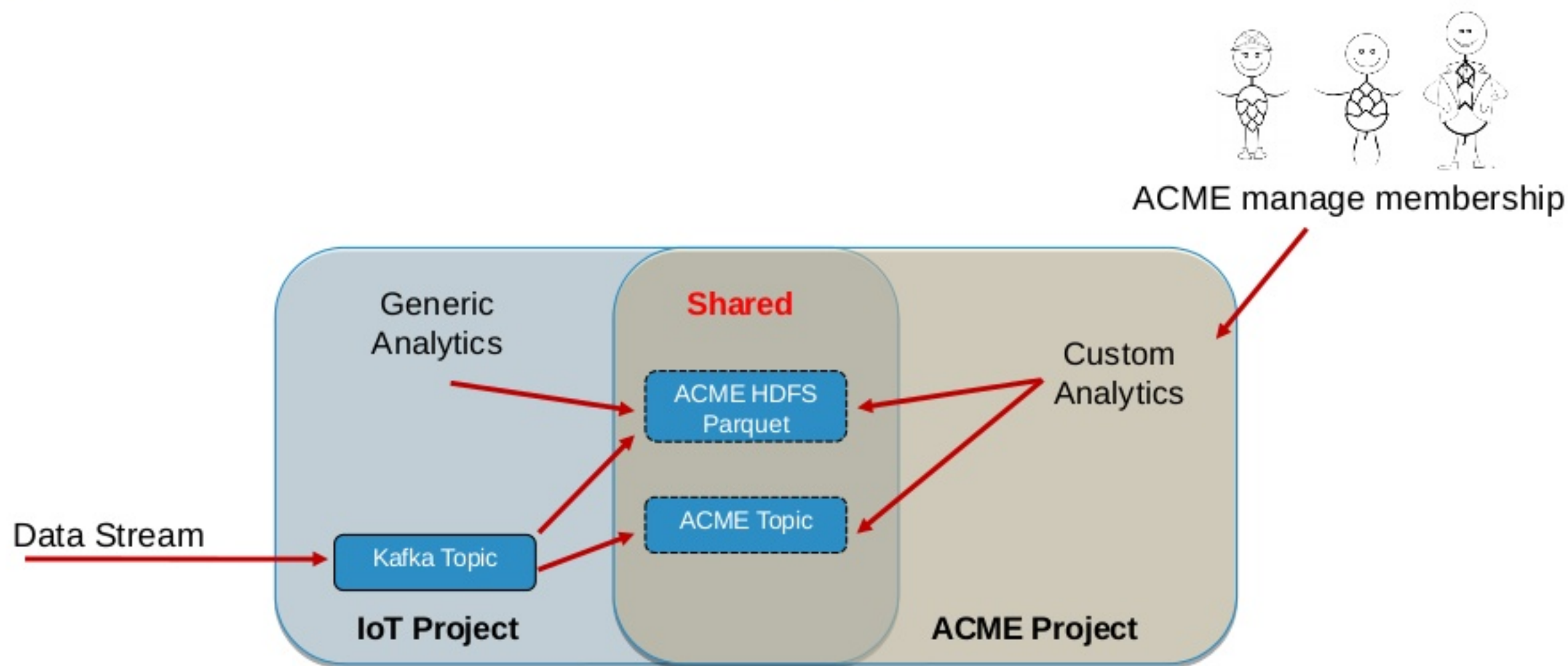
Field Gateway



# Cloud Native Solution



# Hopsworks Solution: Project per Customer



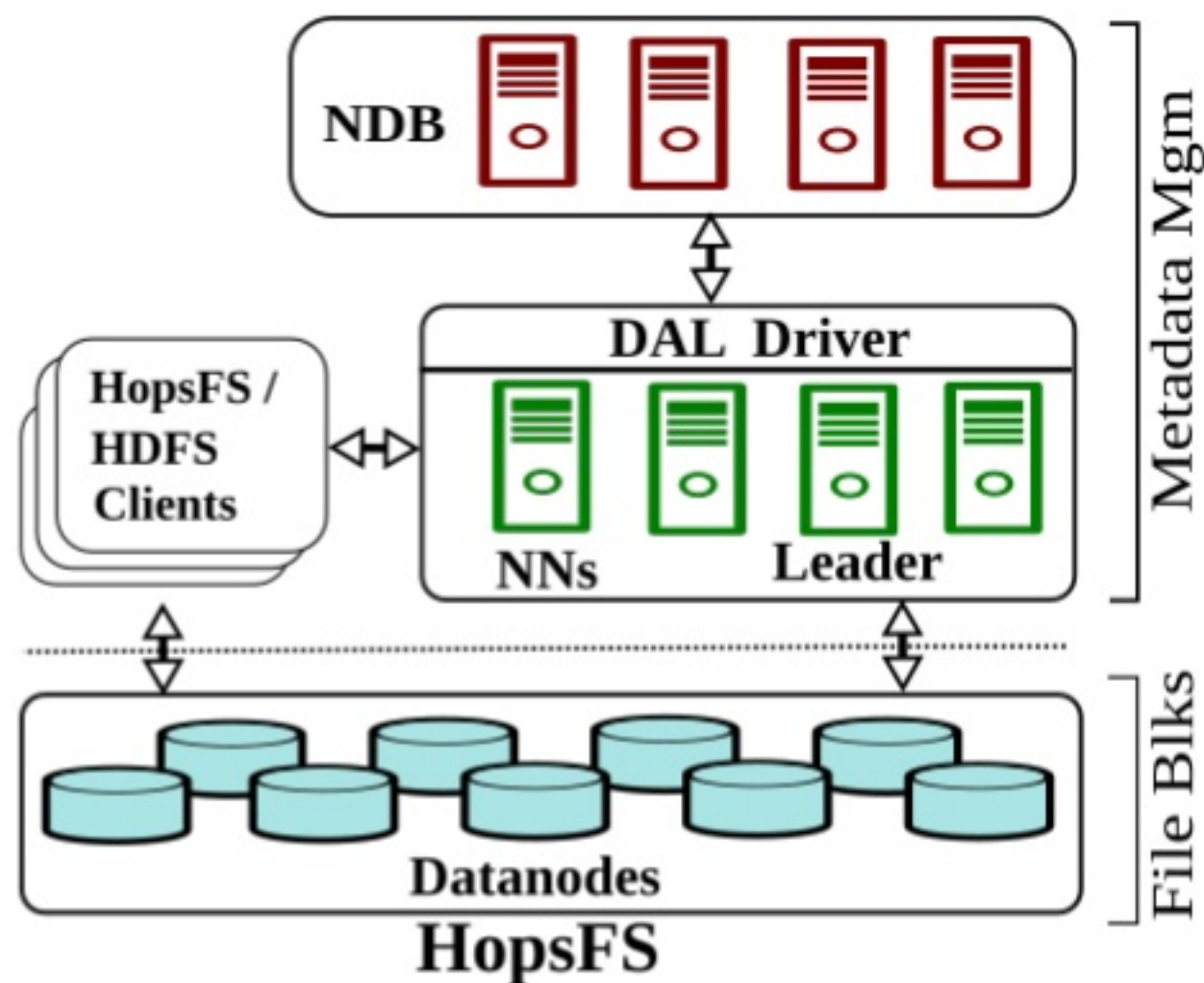
# Spark Streaming Tooling

- Hops Hadoop
- Apache Kafka
- ELK Stack
- Grafana/InfluxDB
- Jupyter/Apache Zeppelin



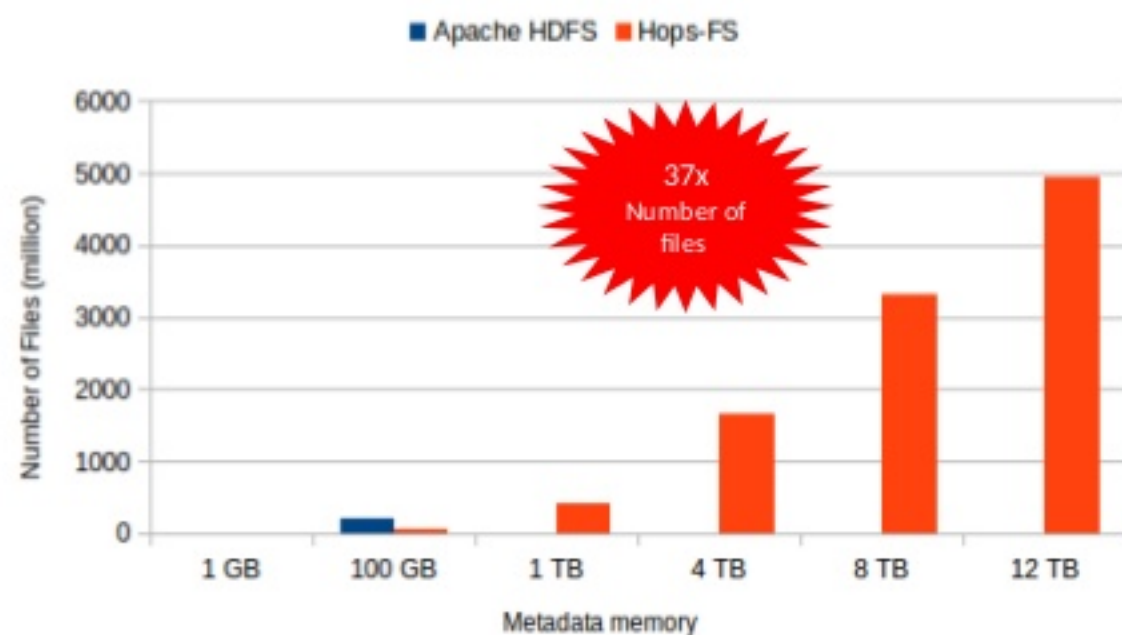
Hopsworks  
Self-Service

# HopsFS – Scale-out HDFS

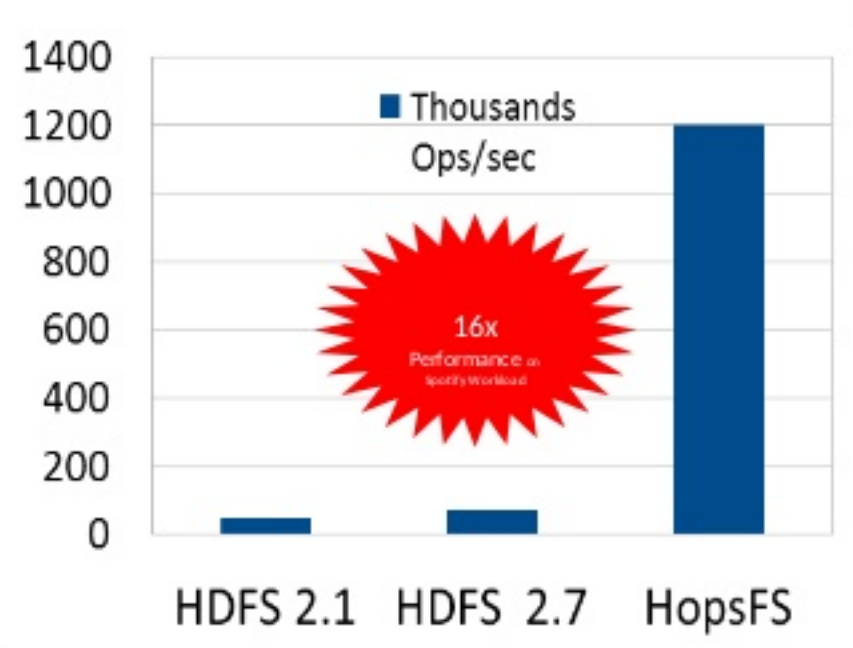




# HopsFS: Next Generation HDFS\*



**Bigger**



**Faster**



Scale Challenge Winner (2017)

\*<https://www.usenix.org/conference/fast17/technical-sessions/presentation/niazi>

# Kafka Self-Service UI

The screenshot displays the HopsWorks Kafka Self-Service UI. The interface includes a top navigation bar with the HopsWorks logo, a search bar, and a user profile. A left sidebar contains navigation links for 'producer', 'Zeppelin', 'Jobs', 'Jobs History', 'Kafka', 'Data Sets', 'Settings', 'Members', and 'Metadata Designer'. The main content area is divided into 'Topics' and 'Schemas' tabs. The 'Topics' tab shows a list of topics, with 'heliotopic' selected. Below the topic name, there are buttons for 'New Topic', 'Schema (v)', 'ACL', 'Share', 'Advanced', and 'Remove'. A table below these buttons lists permissions for 'producer' and 'consumer' users. At the bottom, a table shows partition details for 'heliotopic'.

Project	UserEmail	Permission	Operation	Host	Role	Remove	Edit
producer	admin@kth.se	allow	*	*	*		
consumer	tkak@kth.se	allow	*	*	*		

Partition id	Partition leader	Partition replicas	Insync replicas
1	10.0.2.15	[{"10.0.2.15"}]	[{"10.0.2.15"}]
0	10.0.2.15	[{"10.0.2.15"}]	[{"10.0.2.15"}]

## Manage & Share

- Topics
- ACLs
- Avro Schemas

# Tuning Kafka/Spark Streaming

- Key Kafka Tuning Parameters
  - Number of Topics
  - Number of Partitions per Topic
- Spark Streaming Tuning Considerations
  - Match # of Executors to the # of Partitions
  - Ensure balanced data across partitions

# Realtime Logs

- YARN aggregates logs on job completion
  - No good to us for Streaming
- Collect logs and make them searchable in real-time using Logstash, Elasticsearch, and Kibana
  - Log4j auto-configured to write to Logstash

<http://mkuthan.github.io/blog/2016/09/30/spark-streaming-on-yarn/>



# Realtime Logs

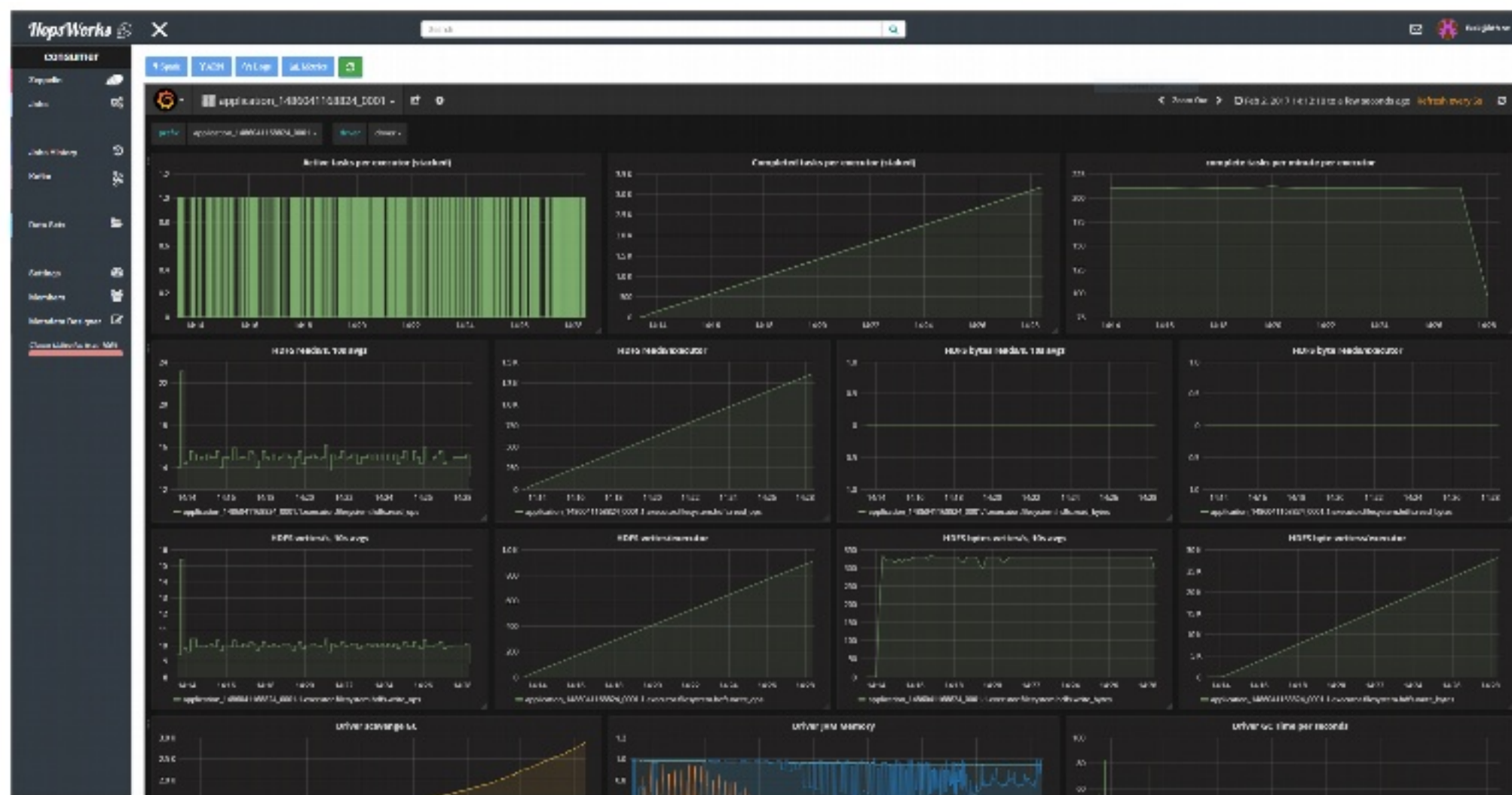
[illegible]

# Elasticsearch, Logstash, Kibana (ELK Stack)

# Resource Monitoring/Alerting

- \$SPARK\_HOME/conf/metrics.properties
  - Different sinks supported
    - JMX, **Graphite**, Servlet/JSON, CSV, Console, Slf4j
- StructuredQueryListener
  - Send query progress to a Kafka topic for inspection
- StreamingQueryListener
  - Asynchronous Monitoring of all queries for a Spark session

# Resource Monitoring/Alerting



Graphite/  
InfluxDB  
and  
Grafana



# Zeppelin for Prototyping Streaming Apps

The screenshot displays the HopsWorks web interface. On the left is a dark sidebar with navigation links: Zeppelin, Jobs, Jobs History, Kafka, Data Sets, Settings, Members, and Metadata Designer. The main area shows a 'Create New Notebook' button and three options: 'Goto Zeppelin', a code editor icon, and 'Create New Notebook'. A central window shows a Zeppelin notebook with the title 'Load Data Into Table'. It contains three SQL queries, each followed by a highchart visualization. The first query is a histogram of 'age' values. The second query is a bar chart of 'job' counts. The third query is a histogram of 'value' counts. On the right side of the interface, there is a panel titled 'INTERPRETERS' and 'ADVANCED'. It lists several interpreters: flink interpreter (running), angular interpreter (stopped), livy interpreter (stopped), spark interpreter (stopped), and md interpreter (stopped). A note at the bottom of this panel states: 'Running a paragraph in a notebook will automatically start the necessary interpreters for that job.'

[<https://github.com/knockdata/spark-highcharts>]

# Project Quotas

- Per-Project quotas
  - Storage in HDFS
  - CPU in YARN (Uber-style Pricing)
- Sharing is not Copying
  - Datasets/Topics

SURGE PRICING



Demand is off the charts! Rates have increased to get more Ubers on the road.



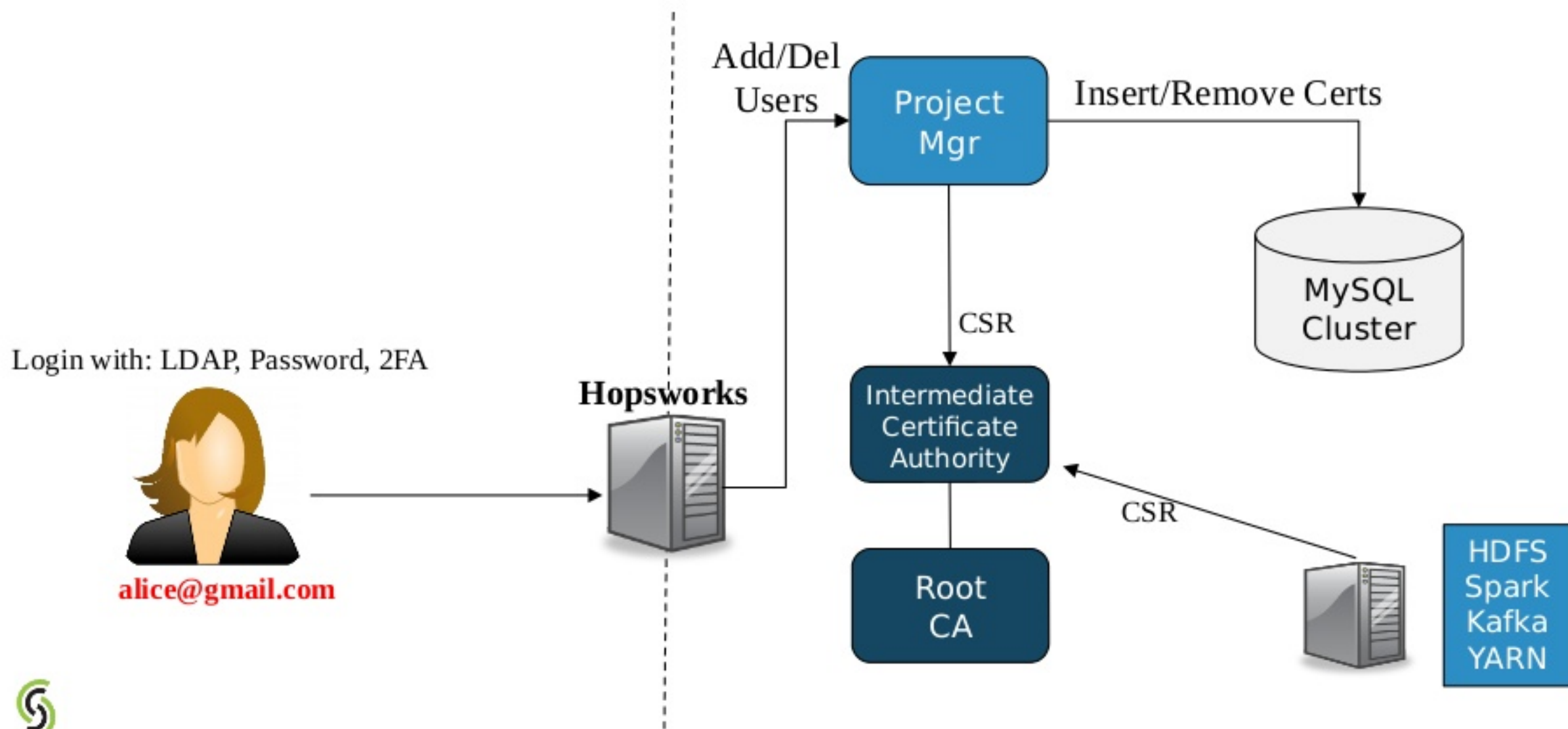


# Secure Spark Streaming

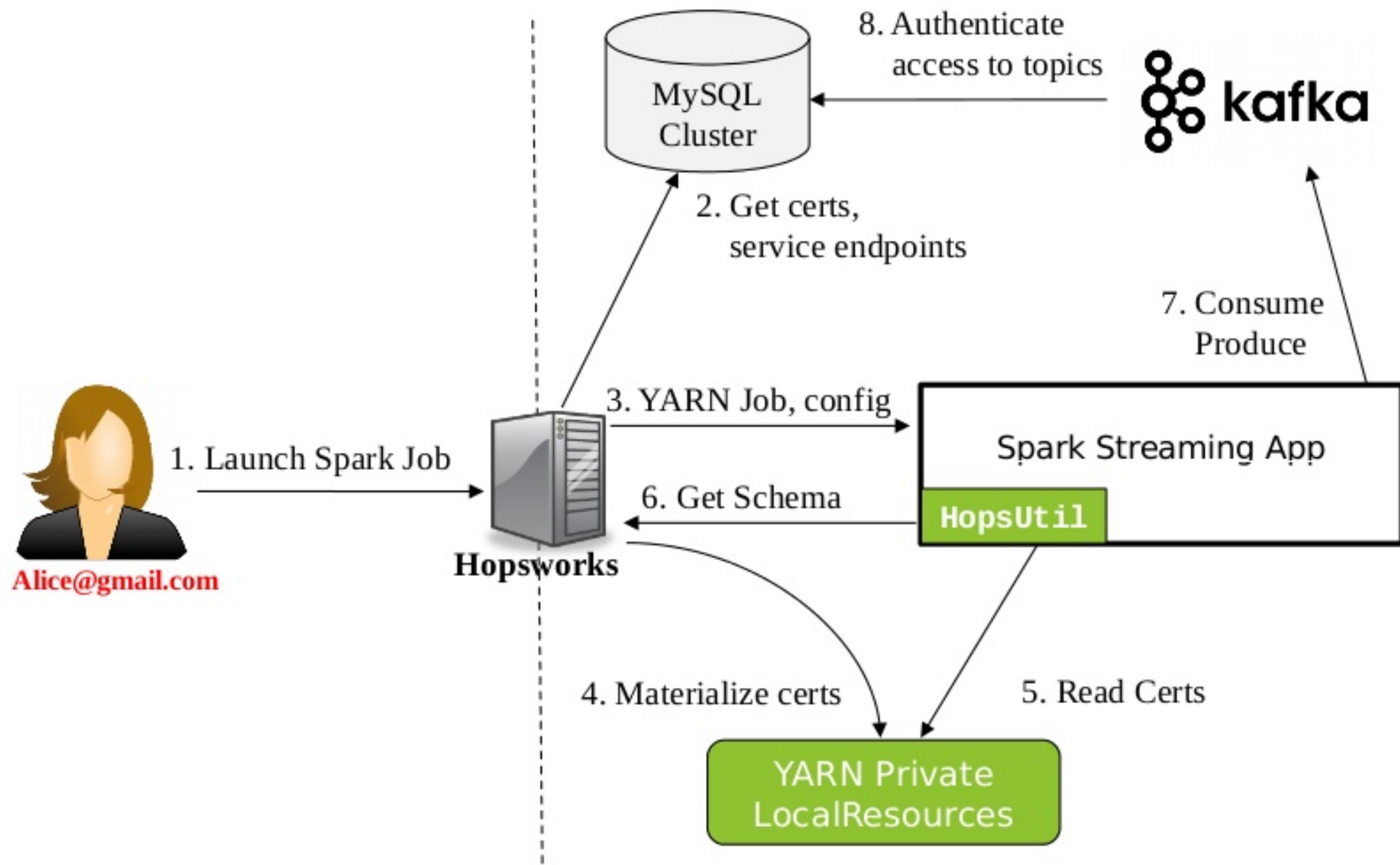
# SSL/TLS Everywhere

- For each project, a user has a different SSL/TLS (X.509) certificate.
  - Client-side SSL certs for authentication
- Services are also issued with SSL/TLS certificates.
  - Kafka performs access control to topics using certs

# SSL/TLS Certificate Generation



# Distributing Certs for Spark Streaming



# Simplified Structured Spark Streaming



# Basic Structured Spark Streaming Program

- Query
- Input source
- Output sink
  - Mode: append/complete/update
- Trigger Interval
- Checkpoint Location

```
val cloudtrailEvents = ...  
  
val streamingETLQuery =  
  cloudtrailEvents  
    .withColumn("date",  
      $"timestamp".cast("date"))  
    .writeStream  
    .trigger(ProcessingTime  
      ("10 seconds"))  
    .format("parquet")  
    .partitionBy("date")  
    .option("path", "/cloudtrail")  
    .option("checkpointLocation",  
      "/cloudtrail.checkpoint/")  
    .start()
```

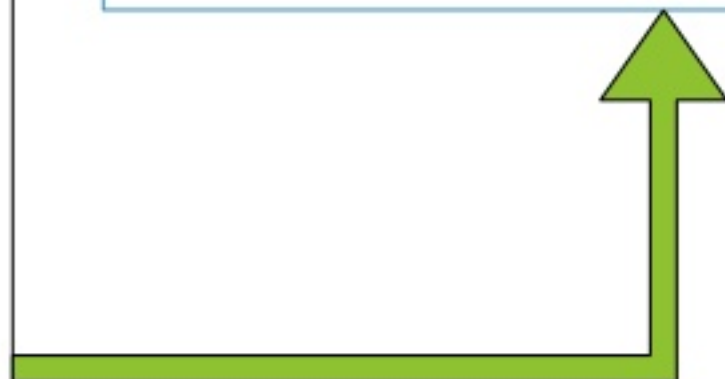
# Secure Structured Spark Streaming

- Streaming Apps also need to know:
  - Credentials, Endpoints
  - monitoring.properties
  - How to shutdown gracefully
- The **HopsUtil API** hides this complexity.

# HopsUtil simplifies Secure Spark/Kafka

```
Properties props = new Properties();
props.put(ProducerConfig.BOOTSTRAP_SERVERS_CONFIG, brokerList);
props.put(SCHEMA_REGISTRY_URL, restApp.restConnect);
props.put(ProducerConfig.KEY_SERIALIZER_CLASS_CONFIG,
org.apache.kafka.common.serialization.StringSerializer.class);
props.put(ProducerConfig.VALUE_SERIALIZER_CLASS_CONFIG,
io.confluent.kafka.serializers.KafkaAvroSerializer.class);
props.put("producer.type", "sync");
props.put("serializer.class", "kafka.serializer.StringEncoder");
props.put("request.required.acks", "1");
props.put("ssl.keystore.location", "/var/ssl/kafka.client.keystore.jks"
)
props.put("ssl.keystore.password", "test1234")
props.put("ssl.key.password", "test1234")
ProducerConfig config = new ProducerConfig(props);
String userSchema =
"{\"namespace\": \"example.avro\", \"type\": \"record\", \"name\": \"U
ser\", \" +
    \"fields\":
[ {\"name\": \"name\", \"type\": \"string\"} ] }";
Schema.Parser parser = new Schema.Parser();
Schema schema = parser.parse(userSchema);
GenericRecord avroRecord = new GenericData.Record(schema);
avroRecord.put("name", "testUser");
Producer<String, String> producer = new Producer<String,
String>(config);
ProducerRecord<String, Object> message = new
ProducerRecord<>("topicName", avroRecord );
producer.send(data);
```

**SparkProducer producer =  
HopsUtil.getSparkProducer();**



# Kafka Producer in HopsWorks

```
SparkConf sparkConf = new SparkConf().setAppName(HopsUtil.getJobName());  
JavaSparkContext jsc = new JavaSparkContext(sparkConf);  
...  
SparkProducer producer = HopsUtil.getSparkProducer();  
...  
producer.produce(message);  
...  
HopsUtil.shutdownGracefully(jsc);
```



# Streaming Consumer in HopsWorks

```
SparkConf sparkConf = new SparkConf().setAppName(HopsUtil.getJobName());  
JavaSparkContext jsc = new JavaSparkContext(sparkConf);  
...  
DataStreamReader dsr = HopsUtil.getSparkConsumer().getKafkaDataStreamReader();  
Dataset<Row> lines = dsr.load();  
...  
StreamingQuery queryFile = logEntries.writeStream()  
...  
HopsUtil.shutdownGracefully(queryFile);
```



**Demo**

# Hops Roadmap

- HopsFS
  - Multi-Data-Center High Availability
  - Small files, 2-Level Erasure Coding
- HopsYARN
  - Tensorflow on Spark with GPUs-as-a-Resource
- Open Datasets
  - P2P Dataset Sharing

# Spark Streaming on Hopsworks

- Hopsworks is a new Data Platform built on Hops
- Spark-Streaming is a First Class Citizen
- Built-in Tooling for Spark-Streaming

# Hops Heads

## Active:

Jim Dowling, Seif Haridi, Tor Björn Minde, Gautier Berthou, Salman Niazi, Mahmoud Ismail, Theofilos Kakantousis, Ermias Gebremeskel, Antonios Kouzoupis, Alex Ormenisan, Roberto Bampi, Fabio Buso, Fanti Machmount Al Samisti, Braulio Grana, Zahin Azher Rashid, Robin Andersson, ArunaKumari Yedurupaka, Tobias Johansson, August Bonds, Filotas Siskos.

## Alumni:

Vasileios Giannokostas, Johan Svedlund Nordström, Rizvi Hasan, Paul Mälzer, Bram Leenders, Juan Roca, Misganu Dessalegn, K "Sri" Srijeeyanthan, Jude D'Souza, Alberto Lorente, Andre Moré, Ali Gholami, Davis Jaunzems, Stig Viaene, Hooman Peiro, Evangelos Savvidis, Steffen Grohsschmiedt, Qi Qi, Gayana Chandrasekara, Nikolaos Stanogias, Daniel Bali, Ioannis Kerkinos, Peter Buechler, Pushparaj Motamari, Hamid Afzali, Wasif Malik, Lalith Suresh, Mariano Valles, Ying Lieu.



# Thank You.

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