

# IoT Applications and Patterns using Apache Spark & Apache Bahir

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IBM  
CODE

# About me - Luciano Resende



Data Science Platform Architect – IBM – CODAIT

- Have been contributing to open source at ASF for over 10 years
- Currently contributing to : Jupyter Notebook ecosystem, Apache Bahir, Apache Toree, Apache Spark among other projects related to AI/ML platforms



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# Open Source Community Leadership



*Founding Partner*



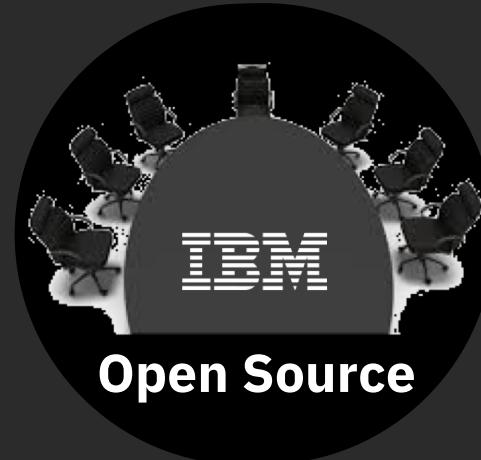
*188+ Project Committers*



*77+ Projects*



**Key Open source steering committee  
memberships**



**OSS Advisory Board**



**CODAIT**

# Center for Open Source Data and AI Technologies

CODAIT aims to make AI solutions dramatically easier to create, deploy, and manage in the enterprise

Relaunch of the Spark Technology Center (STC) to reflect expanded mission



# CODAIT

[codait.org](http://codait.org)



codait (French)  
= coder/coded

<https://m.interglot.com/fr/en/codait>



# Agenda

## Introductions

- Apache Spark
- Apache Bahir

## IoT Applications

## Live Demo

## Summary

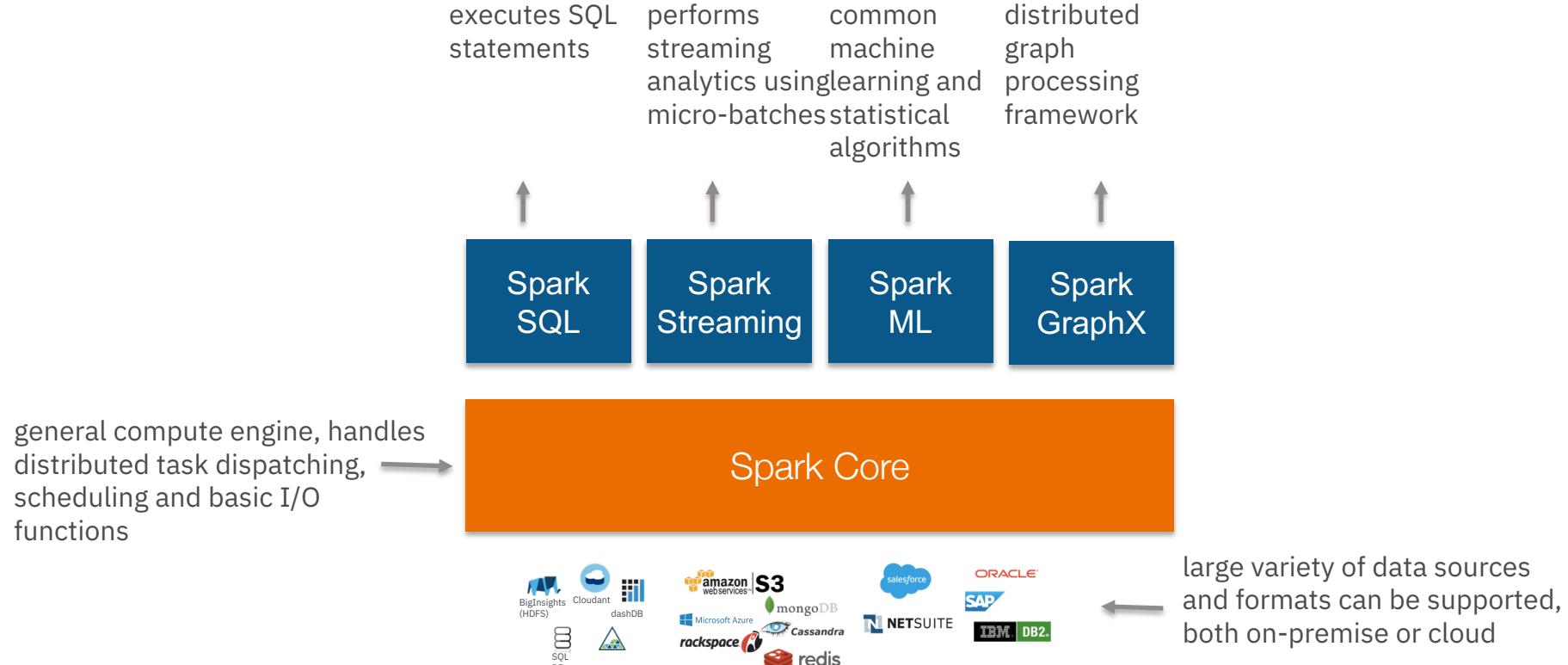
## References

## Q&A

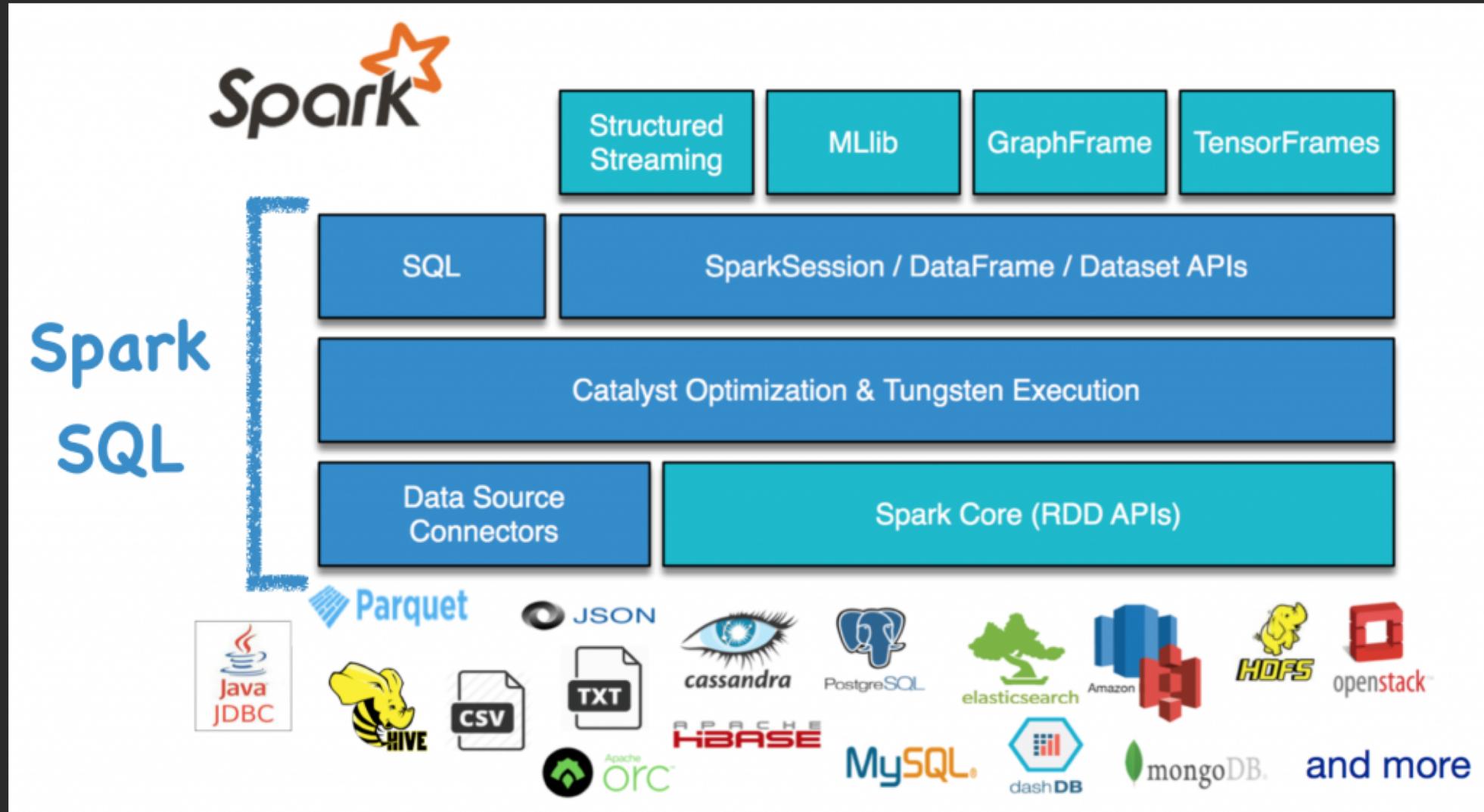
# Apache Spark

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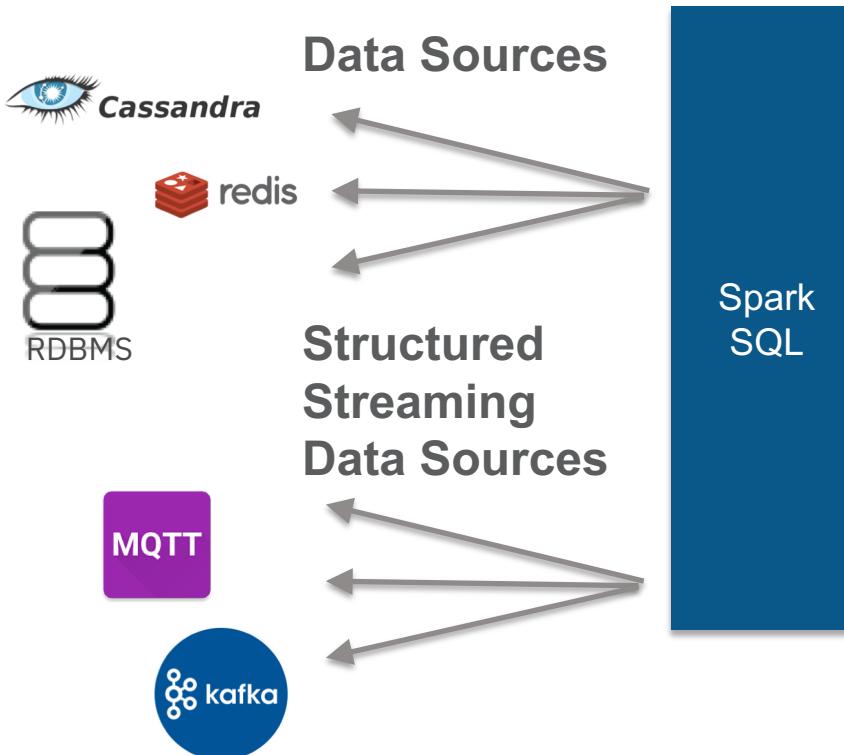
# Apache Spark Introduction



# Apache Spark Evolution



# Apache Spark – Spark SQL



Unified data access APIs: Query structured data sets with SQL or Dataset/DataFrame APIs

Fast, familiar query language across all of your enterprise data

# Apache Spark – Spark SQL

You can run SQL statement with `SparkSession.sql(...)` interface:

```
val spark = SparkSession.builder()  
  .appName("Demo")  
  .getOrCreate()  
  
spark.sql("create table T1 (c1 int, c2 int) stored as parquet")  
  
val ds = spark.sql("select * from T1")
```

You can further transform the resultant dataset:

```
val ds1 = ds.groupBy("c1").agg("c2"-> "sum")  
  
val ds2 = ds.orderBy("c1")
```

The result is a `DataFrame / Dataset[Row]`

`ds.show()` displays the rows

# Apache Spark – Spark SQL

You can read from data sources using `SparkSession.read.format(...)`

```
val spark = SparkSession.builder()  
  .appName("Demo")  
  .getOrCreate()  
  
case class Bank(age: Integer, job: String, marital: String, education: String, balance: Integer)  
  
// loading csv data to a Dataset of Bank type  
  
val bankFromCSV = spark.read.csv("hdfs://localhost:9000/data/bank.csv").as[Bank]  
  
// loading JSON data to a Dataset of Bank type  
  
val bankFromJSON = spark.read.json("hdfs://localhost:9000/data/bank.json").as[Bank]  
  
// select a column value from the Dataset  
  
bankFromCSV.select('age).show() will return all rows of column "age" from this dataset.
```

# Apache Spark – Spark SQL

You can also configure a specific data source with specific options

```
val spark = SparkSession.builder()  
  .appName("Demo")  
  .getOrCreate()  
  
case class Bank(age: Integer, job: String, marital: String, education: String, balance: Integer)  
  
// loading csv data to a Dataset of Bank type  
  
val bankFromCSV = sparkSession.read  
  
  .option("header", "true") // Use first line of all files as header  
  
  .option("inferSchema", "true") // Automatically infer data types  
  
  .option("delimiter", " ")  
  
  .csv("/users/lresende/data.csv")  
  
  .as[Bank]  
  
bankFromCSV.select('age).show() // will return all rows of column "age" from this dataset.
```

# Apache Spark – Spark SQL – Data Sources

## Data Sources under the covers

- Data source registration (e.g. `spark.read.datasource`)
- Provide `BaseRelation` implementation
  - That implements support for table scans:
    - `TableScans`, `PrunedScan`, `PrunedFilteredScan`, `CatalystScan`
- Detailed information available at
  - <https://developer.ibm.com/code/2016/11/10/exploring-apache-spark-datasource-api/>

# Apache Spark – Spark SQL – Data Sources

## Data Sources V1 Limitations

- Leak upper-level API in the data source (DataFrame/SQLContext)
- Hard to extend the Data Sources API for more optimizations
- Zero transaction guarantee in the write APIs
- Limited Extensibility

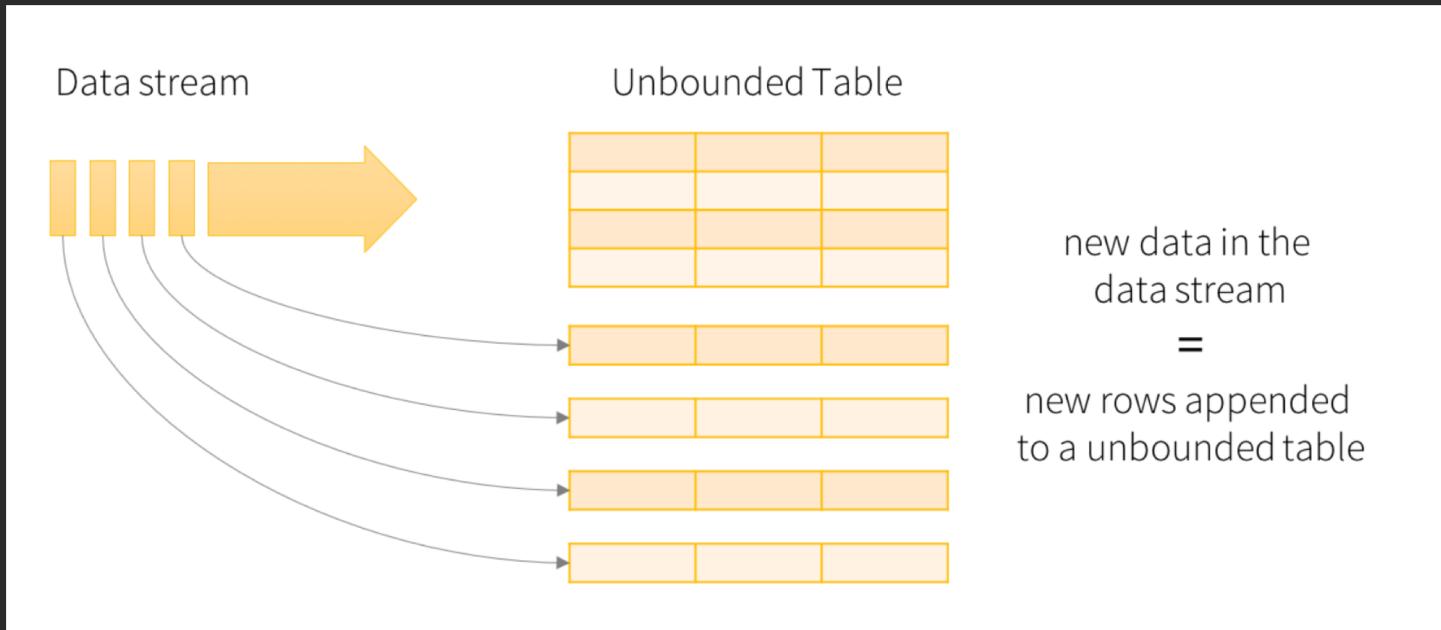
# Apache Spark – Spark SQL – Data Sources

## Data Sources V2

- Support for row-based scan and columnar scan
- Column pruning and filter push-down
- Can report basic statistics and data partitioning
- Transactional write API
- Streaming source and sink support for micro-batch and continuous mode
- Detailed information available at
  - <https://developer.ibm.com/code/2018/04/16/introducing-apache-spark-data-sources-api-v2/>

# Apache Spark – Spark SQL Structured Streaming

Unified programming model for streaming, interactive and batch queries



**Considers the data stream as unbounded table**

# Apache Spark – Spark SQL Structured Streaming

## SQL regular APIs

```
val spark = SparkSession.builder()  
  .appName("Demo")  
  .getOrCreate()
```

```
val input = spark.read  
  .schema(schema)  
  .format("csv")  
  .load("input-path")
```

```
val result = input  
  .select("age")  
  .where("age > 18")
```

```
result.write  
  .format("json")  
  .save(" dest-path")
```

## Structured Streaming APIs

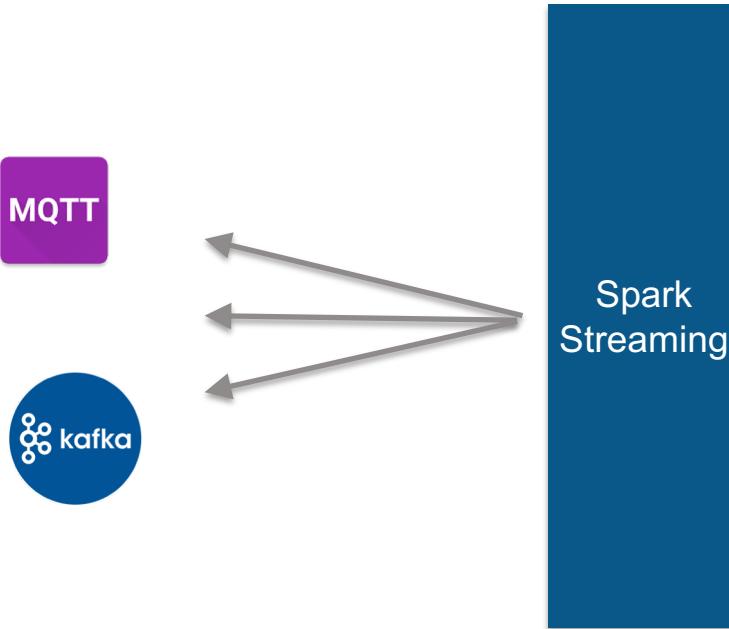
```
val spark = SparkSession.builder()  
  .appName("Demo")  
  .getOrCreate()
```

```
val input = spark.readStream  
  .schema(schema)  
  .format("csv")  
  .load("input-path")
```

```
val result = input  
  .select("age")  
  .where("age > 18")
```

```
result.write  
  .format("json")  
  .startStream(" dest-path")
```

# Apache Spark – Spark Streaming



Micro-batch event processing for  
near-real time analytics

e.g. Internet of Things (IoT) devices,  
Twitter feeds, Kafka (event hub), etc.

No multi-threading or parallel process  
programming required

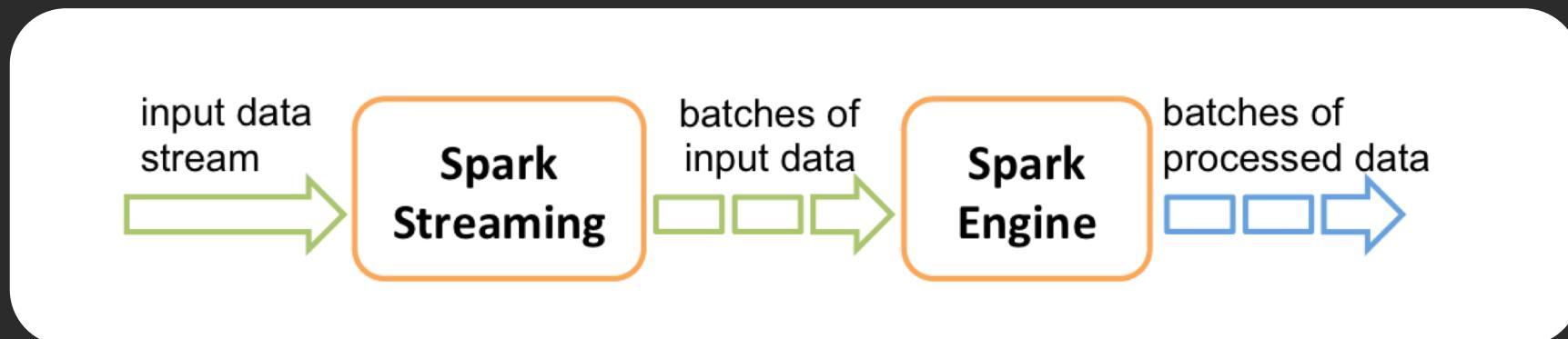
# Apache Spark – Spark Streaming

Also known as discretized stream or DStream

Abstracts a continuous stream of data

Based on micro-batching

Based on RDDs



# Apache Spark – Spark Streaming

```
val sparkConf = new SparkConf()  
  .setAppName("MQTTWordCount")  
  
val ssc = new StreamingContext(sparkConf, Seconds(2))  
  
val lines = MQTTUtils.createStream(ssc, brokerUrl, topic, StorageLevel.MEMORY_ONLY_SER_2)  
  
val words = lines.flatMap(x => x.split(" "))  
val wordCounts = words.map(x => (x, 1)).reduceByKey(_ + _)  
wordCounts.print()  
  
ssc.start()  
ssc.awaitTermination()
```

# Apache Bahir

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# Origins of the Apache Bahir Project

MAY/2016: Established as a top-level Apache Project.

- PMC formed by Apache Spark committers/pmc, Apache Members
- Initial contributions imported from Apache Spark

AUG/2016: Apache Flink community join Apache Bahir

- Initial contributions of Flink extensions
- In October 2016 Robert Metzger elected committer

# Origins of the Bahir name

Naming an Apache Project is a science !!!

- We needed a name that wasn't used yet
- Needed to be related to Spark

We ended up with : Bahir

- A name of Arabian origin that means Sparkling,
- Also associated with a guy who succeeds at everything

# Why Apache Bahir

It's an Apache project

- And if you are here, you know what it means

Benefits of curating your extensions at Apache Bahir

- Apache Governance
- Apache License
- Apache Community
- Apache Brand

# Why Apache Bahir

## Flexibility

- Release flexibility
  - Bounded to platform or component release

## Shared infrastructure

- Release, CI, etc

## Shared knowledge

- Collaborate with experts on both platform and component areas

# Bahir extensions for Apache Spark

MQTT

MQTT – Enables reading data from MQTT Servers using Spark Streaming or Structured streaming.

- <http://bahir.apache.org/docs/spark/current/spark-sql-streaming-mqtt/>
- <http://bahir.apache.org/docs/spark/current/spark-streaming-mqtt/>



Couch DB/Cloudant – Enables reading data from CouchDB/Cloudant using Spark SQL and Spark Streaming.



Twitter – Enables reading social data from twitter using Spark Streaming.

- <http://bahir.apache.org/docs/spark/current/spark-streaming-twitter/>



Akka – Enables reading data from Akka Actors using Spark Streaming or Structured Streaming.

- <http://bahir.apache.org/docs/spark/current/spark-streaming-akka/>



ZeroMQ – Enables reading data from ZeroMQ using Spark Streaming.

- <http://bahir.apache.org/docs/spark/current/spark-streaming-zeromq/>

# Bahir extensions for Apache Spark



Google Cloud Pub/Sub – Add spark streaming connector to Google Cloud Pub/Sub

# Apache Spark extensions in Bahir

## Adding Bahir extensions into your application

- Using SBT

```
libraryDependencies += "org.apache.bahir" %% "spark-streaming-mqtt" % "2.2.0"
```

- Using Maven

```
<dependency>
  <groupId>org.apache.bahir</groupId>
  <artifactId>spark-streaming-mqtt_2.11 </artifactId>
  <version>2.2.0</version>
</dependency>
```

# Apache Spark extensions in Bahir

## Submitting applications with Bahir extensions to Spark

- Spark-shell

```
bin/spark-shell --packages org.apache.bahir:spark-streaming_mqtt_2.11:2.2.0 .....
```

- Spark-submit

```
bin/spark-submit --packages org.apache.bahir:spark-streaming_mqtt_2.11:2.2.0 .....
```

# Internet of Things - IoT

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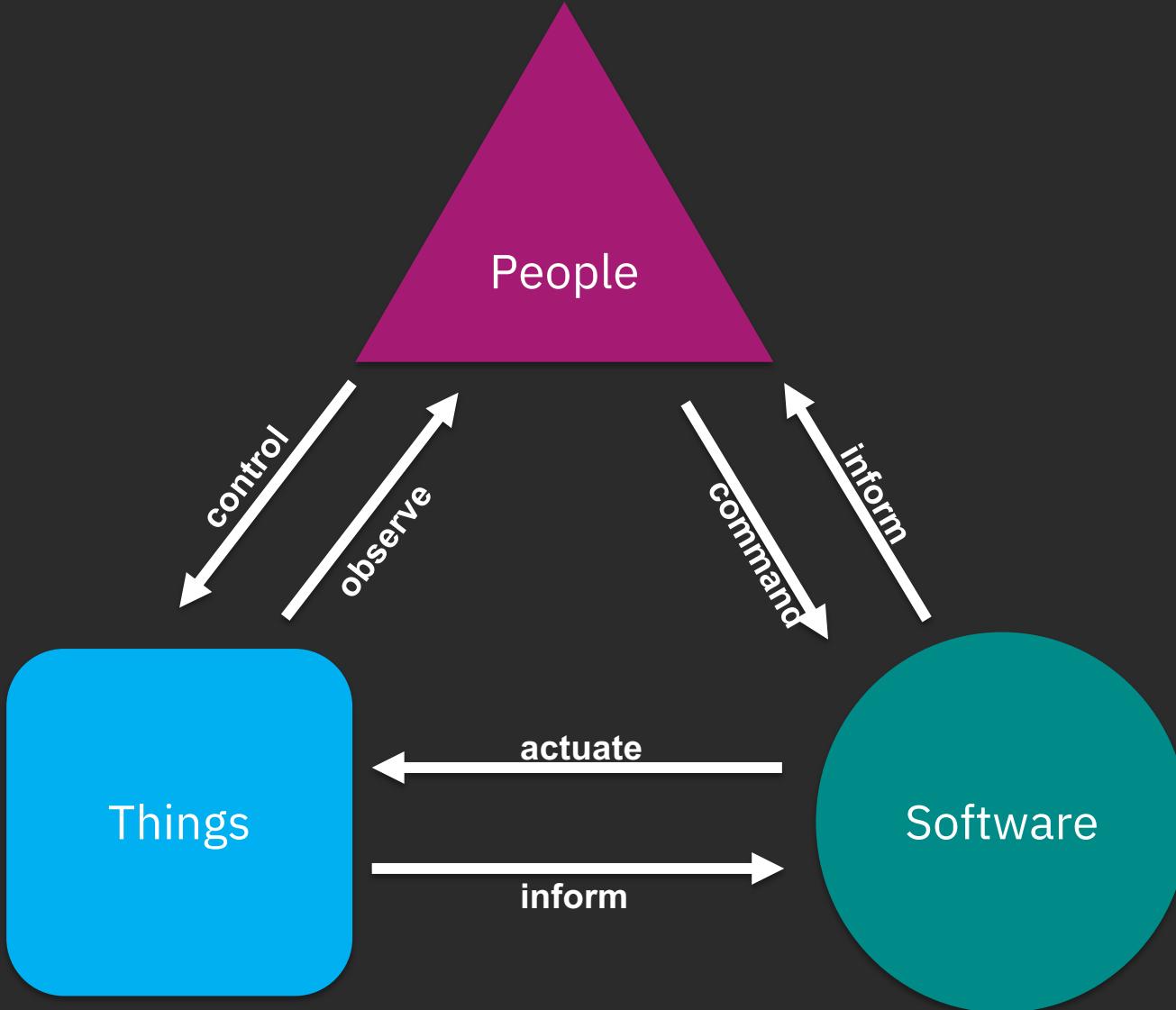
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# IoT – Definition by Wikipedia

The Internet of things (IoT) is **the network of physical devices**, vehicles, home appliances, and other items embedded with electronics, software sensors, actuators, and network **connectivity** which enable these objects to connect and **exchange data**.



# IoT – Interaction between multiple entities



# IoT Patterns – Some of them ...

- Remote control
- Security analysis
- Edge analytics
- Historical data analysis
- Distributed Platforms
- Real-time decisions

# MQTT – M2M / IoT Connectivity Protocol

**Connect  
+  
Publish  
+  
Subscribe**

**Open spec  
+ 40 client  
implementatio  
ns**

**Minimal  
overhead**  
**Tiny  
Clients  
(Java 170KB)**

Header  
2-4 bytes  
(publish)  
14 bytes  
(connect)

**MQTT**



History

~1990  
IBM / Eurotech

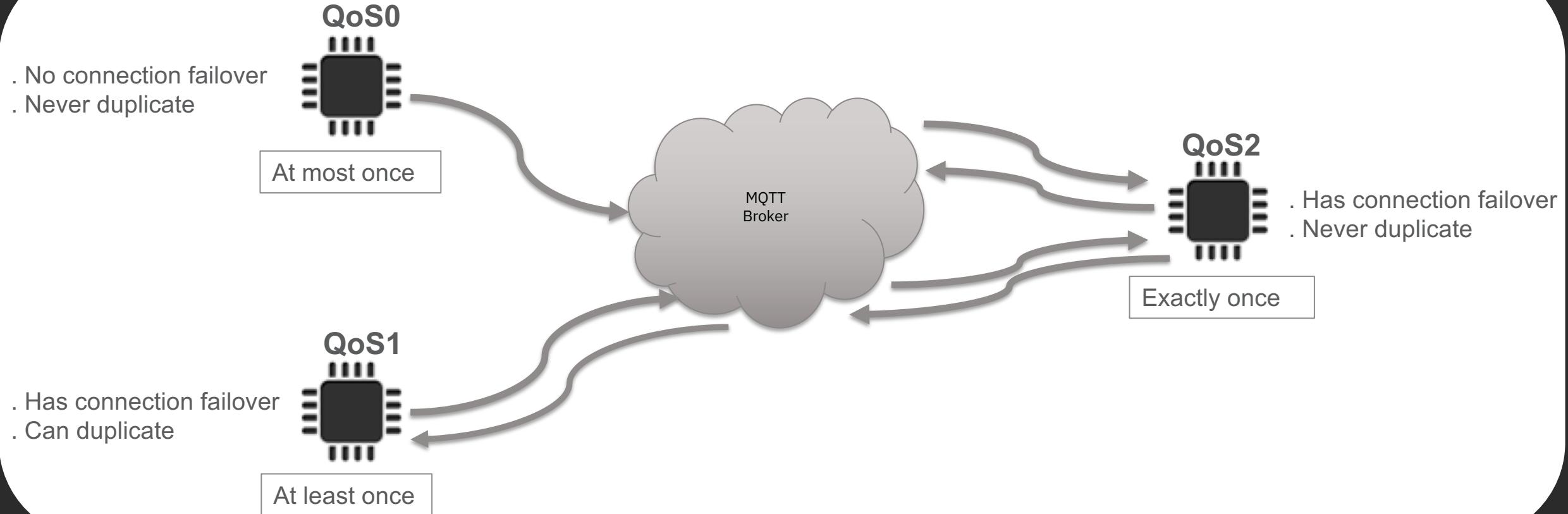
2010  
Published

2011  
Eclipse M2M / Paho

2014  
OASIS

V5  
May 2018

# MQTT – Quality of Service



# MQTT – World usage

Smart Home Automation  
Messaging

Notable Mentions:

- IBM IoT Platform
- AWS IoT
- Microsoft IoT Hub
- Facebook Messenger

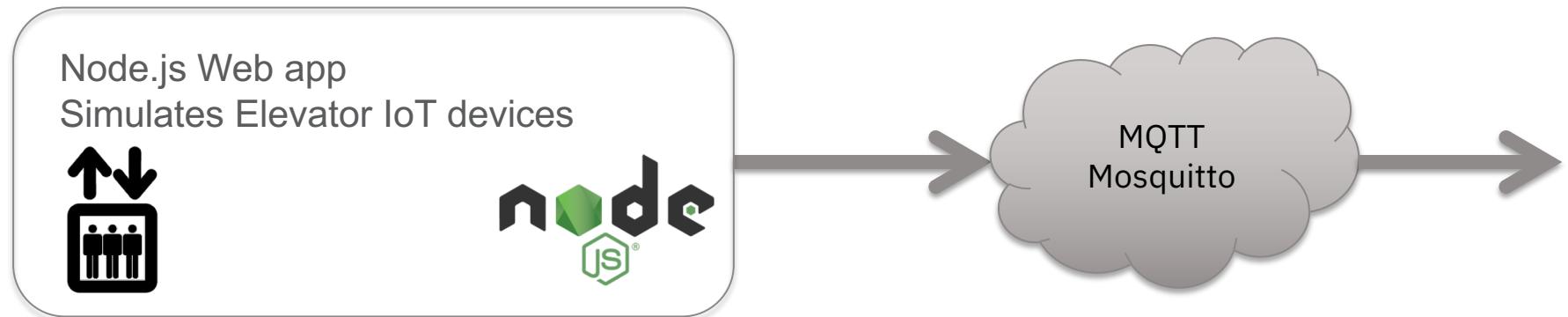
# Live Demo

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# IoT Simulator using MQTT

The demo environment

<https://github.com/lresende/bahir-iot-demo>



Elevator simulator  
Metrics:

- Weight
- Speed
- Power
- Temperature
- System

# Summary

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# Summary – Take away points

## Apache Spark

- IoT Analytics Runtime with support for "Continuous Applications"

## Apache Bahir

- Bring access to IoT data via supported connectors (e.g. MQTT)

## IoT Applications

- Using Spark and Bahir to start processing IoT data in near real time using Spark Streaming and Spark Structured Streaming

Join the Apache  
Bahir community

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# References

## Apache Bahir

<http://bahir.apache.org>

## Documentation for Apache Spark extensions

<http://bahir.apache.org/docs/spark/current/documentation/>

## Source Repositories

<https://github.com/apache/bahir>

<https://github.com/apache/bahir-website>

## Demo Repository

<https://github.com/lresende/bahir-iot-demo>



