

# Tutorial: An Outlook to Declarative Languages for Big Streaming Data

DEBS 2019, Darmstadt, Germany, Europe, Earth,  
Solar System, Milky Way, Universe

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# Who we are



# Agenda

- Introduction on Stream Processing Models
- Declarative Language: Opportunities, and Design Principles
- Comparison of Prominent Streaming SQL Dialects for Big Stream Processing Systems
- Conclusion

# **Unbounded yet time-ordered sequence of data**

*Jennifer Widom*

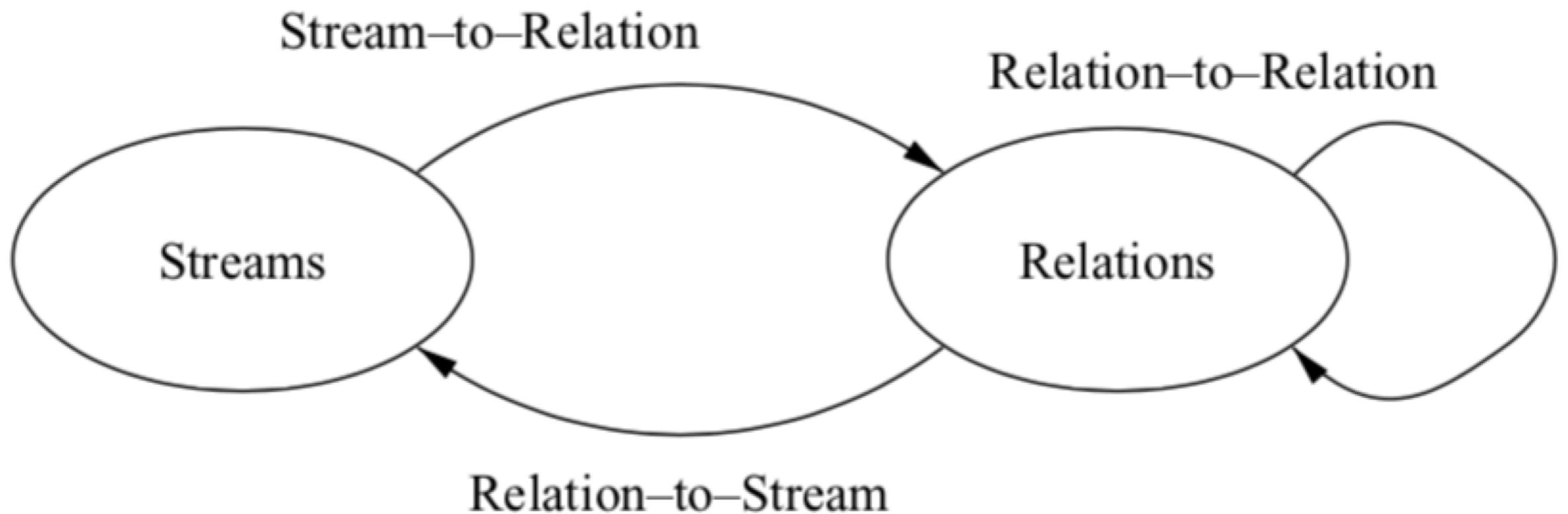
# Stream Processing 101

- Data Stream Management Systems (DSMS)
  - Found origin within databased community
  - focus on continuous query answering and analytics
  - Reference Models inspired by Relational Algebra: CQL, Secret
- Complex Event Processing (CEP)
  - Found origin within software engineering community
  - focus on continuous detection of patterns
  - Reference Models inspired by regular languages: NFA, SNOOP

# Time Management

- **Processing Time** (consumer) implies a total order on the stream.
- **Event Time** (producer), implies a partial order on the data.

# DSMS (CQL)



# DSMS (CQL)

- Expressive Languages (SQL++)
  - Windowing
    - *Canonical*: logical/physical sliding/tumbling
    - *Custom*: session, data-driven, event-driven

# DSMS (CQL)

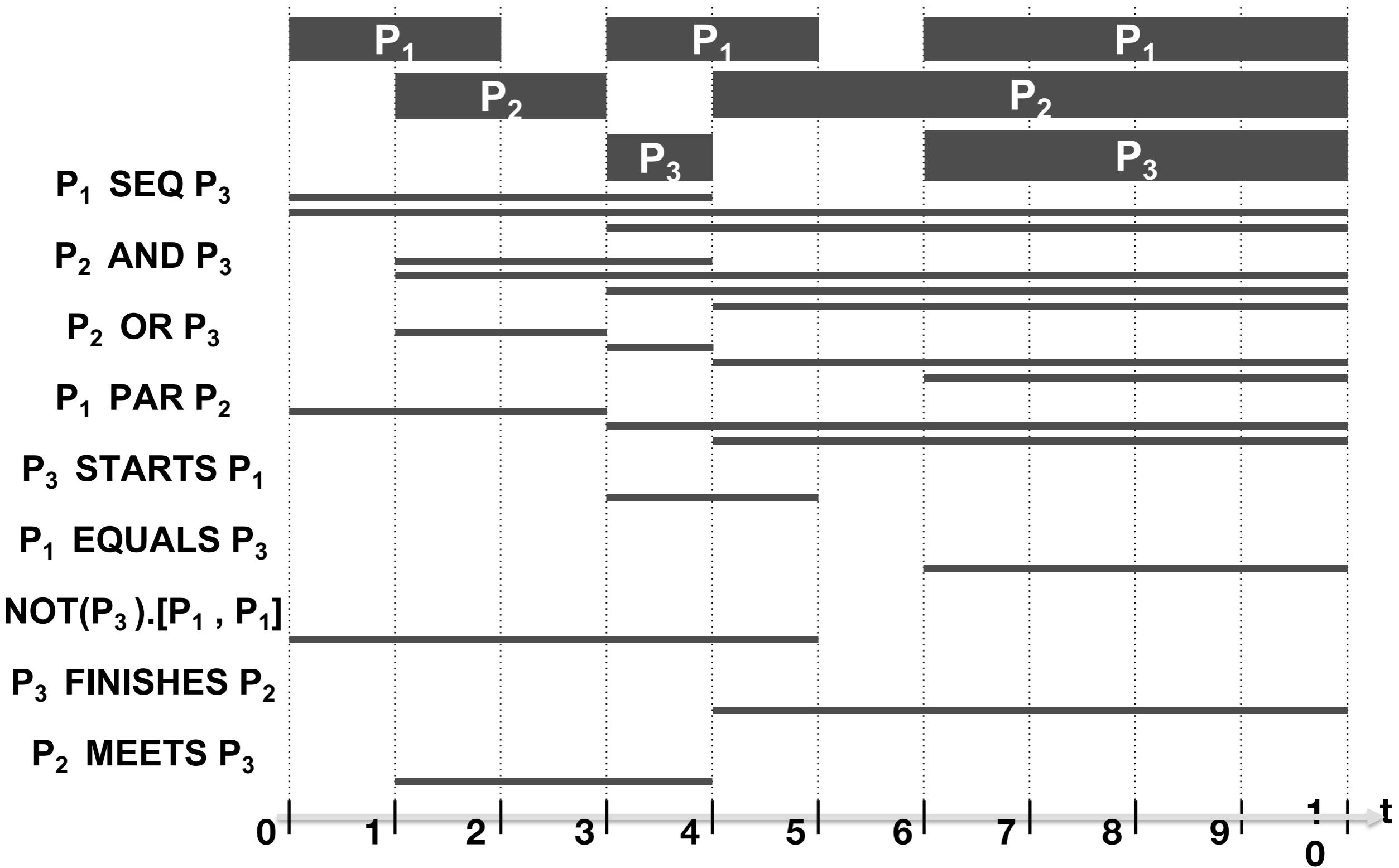
**CREATE SCHEMA** Stock(id string, price float, timestamp int)

```
SELECT avg(price)  
FROM Stock#time(10 minutes)  
OUTPUT EVERY 1 minutes  
GROUP BY id
```

# CEP

- Regular Languages (Declarative)
  - Core from SNOOP (SEQ, AND, OR, NOT, FIRST, LAST)
- Allen's Algebra
- Finite state machines (non-det)

# CEP (SNOOP)



# CEP (SNOOP)

**CREATE SCHEMA** Selling(from string, to string, price float, ts int)

**CREATE SCHEMA** Buying(from string, to string, price float, ts int)

**CREATE SCHEMA** Fraud (sell string, by string)

**INSERT INTO** Fraud

**SELECT** a.id, b.id

**FROM PATTERN**

**[EVERY** a=Selling -> b=Buying(a.from=b.to, a.price > price)]#**time**(10min)

**OUTPUT EVERY** 1 min

# CEP (SNOOP)

**CREATE SCHEMA** AltitudeChange(starts long, ends long, ialt long, falt long)

**CREATE SCHEMA** CruisePeriod(onts long, offts long)

```
SELECT *
FROM CruisePeriod#lastevent AS a,
AltitudeChange#lastevent AS b where a.overlaps(b)
```

# Big Stream Processing

## Ecosystem



**VOLTDB**



# Big Stream Processing

## Fully-Distributed Systems

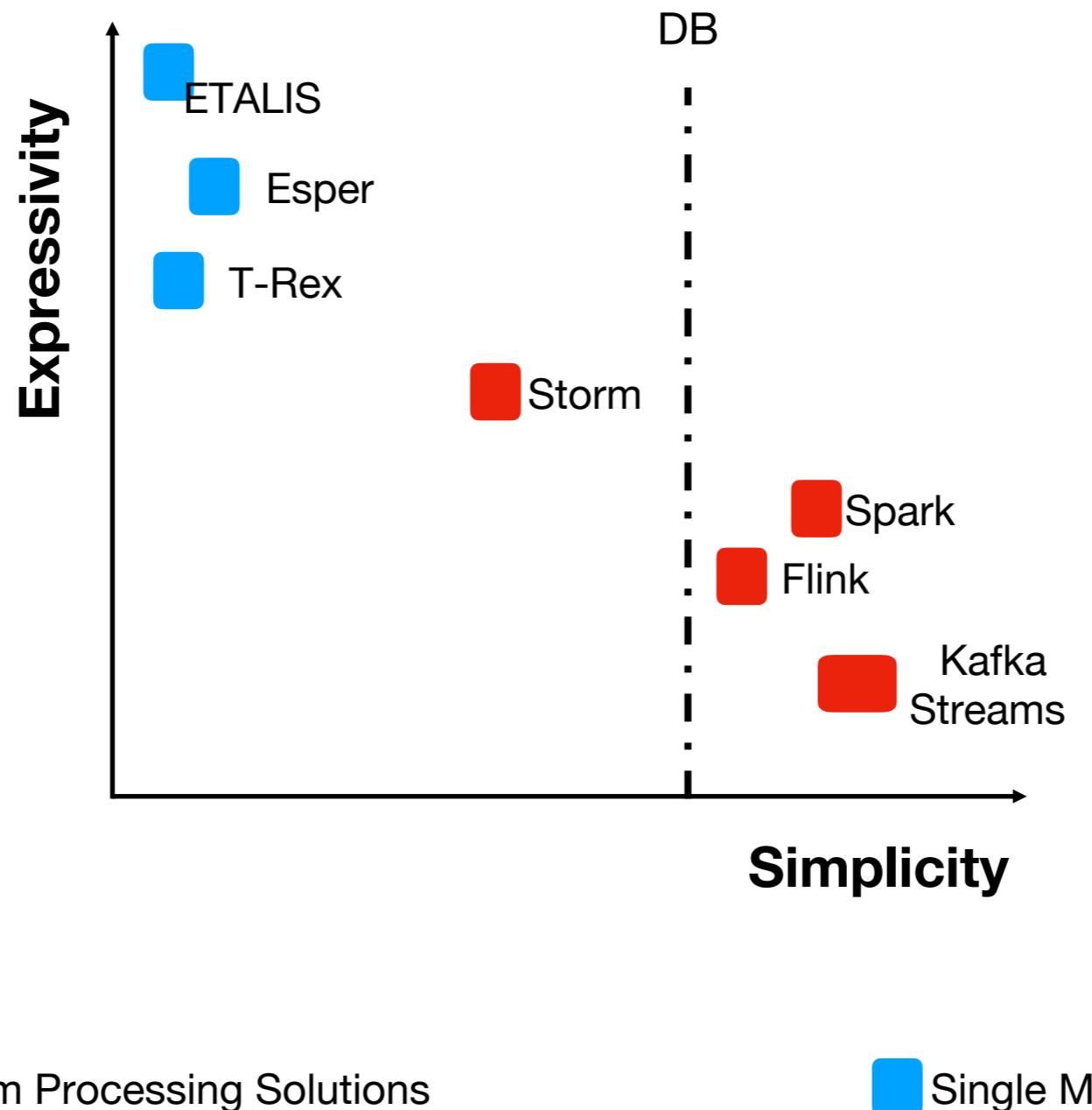
- Fault-Tolerant:
  - **At-Least-Once or Exactly-Once semantics**
- Scalable (millions of tuples per minute)
- Flexible Programmatic API that guides towards the creation of Direct Acyclic Graph

# Big Stream Processing

## Languages

- Offer languages that are embedded in a general-purpose host language, typically Java
- Encourage developers to **explicitly** code a Direct-Acyclic Graph
- Provide relational operators, but also expose low-level details such as partitioning, timestamp extraction

# Solution Landscape (qualitative)



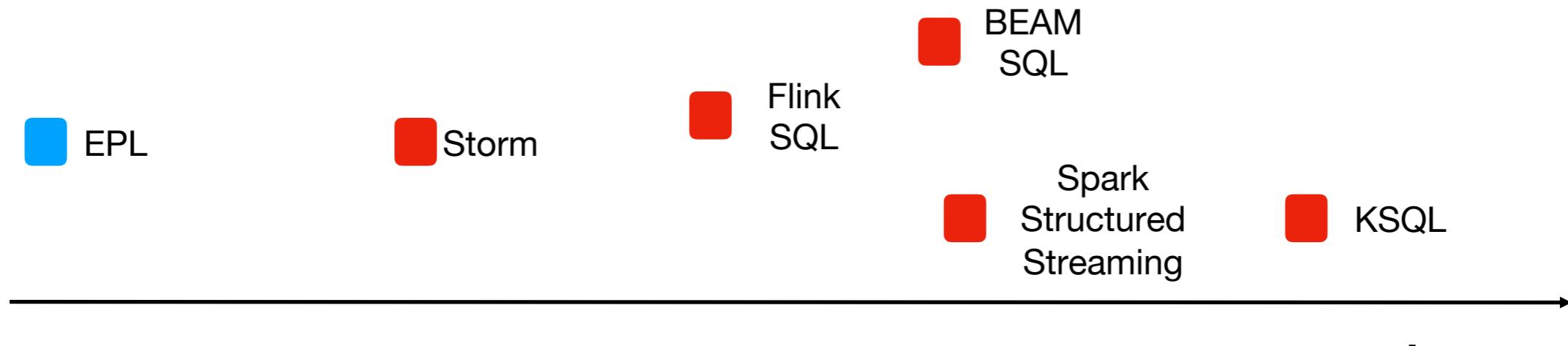
# Big Stream Processing

## (Issues)

- Distributions makes out-of-order handling a primary problem, and, thus solutions appears in the programmatic APIs.
- Languages are not self-contained, thus, are **hard to isolate** clearly from the host language
- Debugging, benchmarking, and standardisation becomes hard

**Major systems started migrating towards a fully-declarative approach ultimately evolved into SQL-like streaming DSL.**

# Adoption of SQL-like interface



■ Big Stream Processing Solutions

■ Single Machine

# One SQL to Rule Them All: An Efficient and Syntactically Idiomatic Approach to Management of Streams and Tables

An Industrial Paper

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## ABSTRACT

Real-time data analysis and management are increasingly critical for today's businesses. SQL is the de facto *lingua franca* for these endeavors, yet support for robust streaming analysis and management with SQL remains limited. Many approaches restrict semantics to a reduced subset of features and/or require a suite of non-standard constructs. Additionally, use of event timestamps to provide native support for analyzing events according to when they actually occurred is not pervasive, and often comes with important limitations.

We present a three-part proposal for integrating robust streaming into the SQL standard, namely: (1) time-varying relations as a foundation for classical tables as well as stream-

## CCS CONCEPTS

- Information systems → Stream management; Query languages;

## KEYWORDS

stream processing, data management, query processing

## ACM Reference Format:

Edmon Begoli, Tyler Akidau, Fabian Hueske, Julian Hyde, Kathryn Knight, and Kenneth Knowles. 2019. One SQL to Rule Them All: An Efficient and Syntactically Idiomatic Approach to Management of Streams and Tables: An Industrial Paper. In *2019 International Conference on Management of Data (SIGMOD '19)*, June 20–July 5,