# The CQL Continuous Query Language: Semantic Foundations and Query Execution

Arvind Arasu, Shivnath Babu, Jennifer Widom

Presented by: Young-Rae Kim



You are here!

#### **INTRODUCTION**

# <u>CQL</u> – <u>Continuous Query Language</u>

### 2003: A CQL Odyssey

"Many papers include example continuous queries expressed in some declarative language .... However, ... a precise language semantics, ... often is left unclear." [1]

### 2003: A CQL Odyssey

"Furthermore, very little has been published to date covering execution details of general-purpose continuous queries." [1]

### 2003: A CQL Odyssey

"It may appear initially that defining a continuous query language over (relational) streams is not difficult ....

However, as queries get more complex ... the situation becomes much murkier." [1]

#### It's all about the abstract semantics

CQL abstract semantics is based on

#### 2 data types

- Streams
- Relations

#### 3 classes of operators

- Stream-to-Relation
- Relation-to-Relation
- Relation-to-Stream



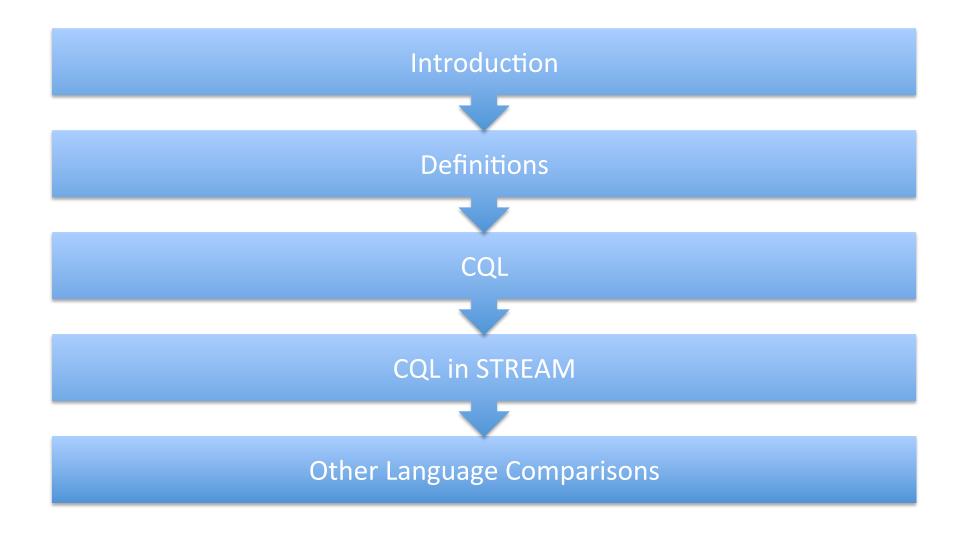
# It's all about the abstract semantics – Goals

- 1. Make it easy to understand; familiar.
- 2. Simple queries should be easy to write, compact, and shouldn't be visually deceiving.

# Query Execution Plans Matter Too! - Goals

- 1. Plans should consist of modular and pluggable components based on generic interfaces
- 2. An execution model that efficiently captures the combination of streams and relations
- 3. An architecture that makes performance-based experimentation easy.

# A Roadmap





The technical stuff.

#### **DEFINITIONS**

#### Streams vs. Relations

#### **Streams**

"a (possibly infinite) bag
 "A relation R is a
 (multiset\*) of elements
 <s, τ>"<sup>[2]</sup>
 finite but unbour

#### **Relations**

 "A relation R is a mapping from T to a finite but unbounded bag of tuples belonging to the schema of R."[3]

#### **Abstract Semantics**

#### **Continuous Semantics**

- Assume a discrete, ordered time domain T.
- Inputs are either streams or relations
- In discussing the result of a continuous query Q at a time τ s, there are 2 possibilities:
  - 1. The outermost operator in Q is relation-to-stream. The result of Q at time  $\tau$  is S (the produced stream) up to  $\tau$ .
  - 2. The outermost operator in Q is stream-to-relation or relation-to-relation. The result of Q at time  $\tau$  is  $R(\tau)$  (the produced relation).
- Time only "advances" from  $\tau$  from  $(\tau 1)$  when all inputs up to  $\tau 1$  have been processed.

What we're all here for.

CQL

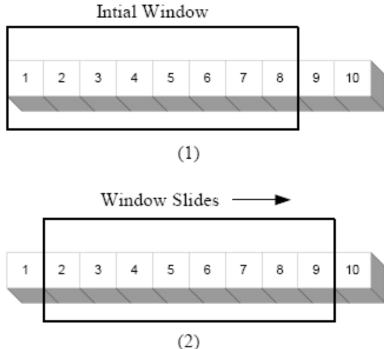


### Operators: Stream-to-Relation

Based on the concept of a sliding window over a stream.

- SQL-99 derivative.
- 3 classes:
  - Time-based
     "S [Range T]"
  - Tuple-based "S [Rows N]"
  - 3. Partitioned

"S [Partition By A1, ..., Ak Rows NJ"



### Operators: Relation-to-Relation

• Derived from traditional SQL.

### Operators: Relation-to-Stream

- 3 operators:
  - Istream ("insert stream")

$$\mathtt{Istream}(R) = \bigcup_{\tau \geq 0} ((R(\tau) - R(\tau - 1)) \times \{\tau\})$$

Dstream ("delete stream")

$$\mathtt{Dstream}(R) = \bigcup_{\tau > 0} ((R(\tau - 1) - R(\tau)) \times \{\tau\})$$

Rstream ("relation stream")

$$\mathtt{Rstream}(R) = \bigcup_{\tau \geq 0} (R(\tau) \times \{\tau\})$$

# Operators: Example

SELECT Istream(\*)
FROM PosSpeedStr [Range Unbounded]
WHERE speed > 65

Relation-to-Relation

#### **Shortcuts & Defaults**

#### **Default Windows**

 Unbounded windows are applied to streams by default.

#### <u>Default Relation-to-Stream Operators</u>

 An intended Istream operator may be omitted from a CQL query.

### Post Shortcut Query Example

SELECT \*
FROM PosSpeedStr
WHERE speed > 65

### Equivalences

- Important for query-rewrite optimizations
- All equivalences that hold in SQL with standard relational semantics carry over to the relational portion of CQL.
- 2 stream-based equivalences in CQL:
  - 1. Window reduction
  - 2. Filter-window commutativity

# Equivalences: Window Reduction

SELECT Istream(L)
FROM S [Range Unbounded]
WHERE C

is equivalent to

SELECT Rstream(L) FROM S [Now] WHERE C

# Equivalences: Window Reduction

SELECT Istream(L)
FROM S [Range Unbounded]
WHERE C

is equivalent to

SELECT Rstream(L)
FROM S [Now]
WHERE C

# Equivalences: Filter-Window Commutativity

(SELECT L FROM S WHERE C) [Range T]

is equivalent to

SELECT L
FROM S [Range T]
WHERE C

# Equivalences: Filter-Window Commutativity

(SELECT L FROM S WHERE C) [Range T]

is equivalent to

SELECT L
FROM S [Range T]
WHERE C

# Equivalences: Filter-Window Commutativity

(SELECT L FROM S WHERE C) [Range T]

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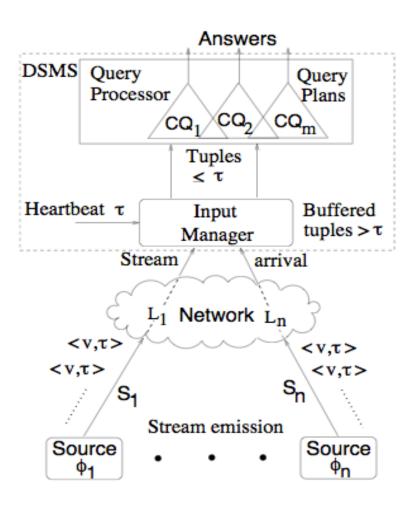
### Time Management

- More realistic conditions: we make the aforementioned assumption.
  - The network conveying the stream elements to the DSMS may not guarantee in-order transmission
  - Streams pause and restart
- Use additional "meta-input" to the system to cope
  - 'heartbeats' in STREAM

# Time Management: Heartbeats

- A heartbeat consists simply of a timestamp  $\tau \in T$ .
- After arrival of the heartbeat, the system will reject stream elements with timestamp  $\leq \tau$ .
- Various ways to generate heartbeats

#### **Environment Overview**





Hot and STREAM-y.

### **CQL IMPLEMENTATION IN STREAM**

### STREAM Query Plans

- Each query plan runs continuously and is composed of 3 different types of components:
  - Operators
  - Queues
  - Synopses

#### **Operators**

- Read from one or more input queues, processes the input based on its semantics, and writes its output to an output queue.
- In STREAM, every operator is either a CQL operator or a system operator.

# Operators

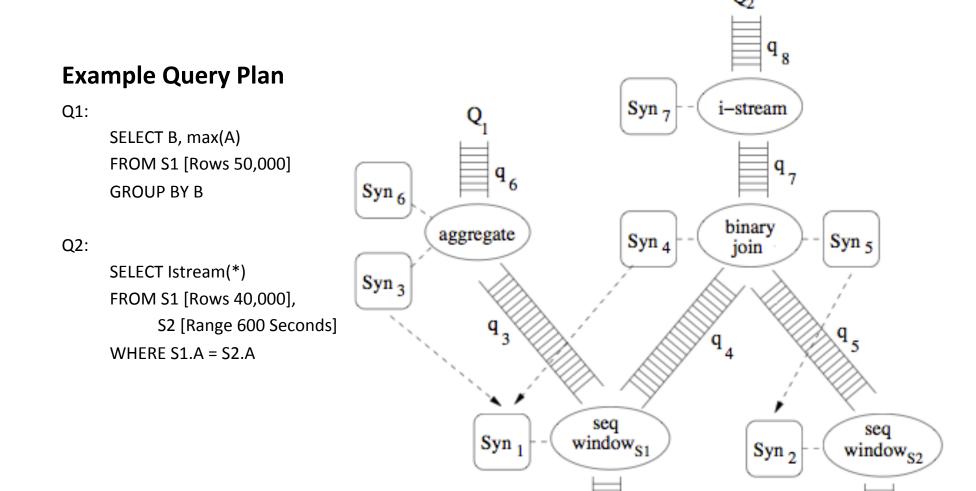
Name	Operator Type	Description
seq-window	stream-to-relation	Implements time-based, tuple-based,
		and partitioned windows
select	relation-to-relation	Filters tuples based on predicate(s)
project	relation-to-relation	Duplicate-preserving projection
binary-join	relation-to-relation	Joins two input relations
mjoin	relation-to-relation	Multiway join from [VNB03]
union	relation-to-relation	Bag union
except	relation-to-relation	Bag difference
intersect	relation-to-relation	Bag intersection
antisemijoin	relation-to-relation	Antisemijoin of two input relations
aggregate	relation-to-relation	Performs grouping and aggregation
duplicate-eliminate	relation-to-relation	Performs duplicate elimination
i-stream	relation-to-stream	Implements Istream semantics
d-stream	relation-to-stream	Implements Dstream semantics
r-stream	relation-to-stream	Implements Rstream semantics
stream-shepherd	system operator	Handles input streams arriving over the network
stream-sample	system operator	Samples specified fraction of tuples
stream-glue	system operator	Adapter for merging a stream-
		producing view into a plan
rel-glue	system operator	Adapter for merging a relation-
		producing view into a plan
shared-rel-op	system operator	Materializes a relation for sharing
output	system operator	Sends results to remote clients

#### Queues

- Connect its input operator to its output operator.
- Stored entirely in memory.\*

#### Synopses

- Store the intermediate state needed by continuous query plans.
  - E.g. performing a windowed join of two streams
- Many synopses are logical "stubs" that primarily point into other synopses.
- Most common use of a synopsis is to materialize the current state of a relation.
- Also stored entirely in memory.\*



 $\mathbf{S}_1$ 

### **Query Optimization**

- Naïve query plan generator.
- Commonly applied heuristics:
  - Push selections below joins
  - Maintain and use indexes for synopses on binaryjoin, mjoin, and aggregate operators.
  - Share synopses within query plans whenever possible.



We're #1.

# COMPARISON WITH OTHER LANGUAGES

### **Tapestry**

- Expressed using SQL syntax.
- Does not support sliding windows over streams or any relation-to-stream operators.

#### Tribeca

- Based on stream-to-stream operators.
- Queries take a single stream as input and produce a single stream as output, with no notion of relation.

#### **Aurora**

- Difficult to compare the procedural query interface of Aurora against a declarative language (CQL).
- Some distinctions:
  - Aggregation operators defined by user-defined functions and have optional parameters set by the user
  - Aurora does not explicitly support relations.

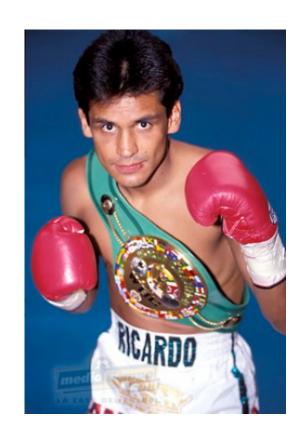
# TelegraphCQ (Stream-Only)

 Note that we can derive a stream-only language in CQL anyways.

- Motivations for CQL's dual approach:
  - Make it easy to understand; familiar.
  - More intuitive queries.
  - Use of both relations and streams cleanly generalizes materialized views.

El finito.

#### **THE END**



## Image Sources (in order)

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- StartFragment EndFragment
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