

DEBS Grand Challenge: RDF Stream Processing with CQELS Framework for Real-time Analysis

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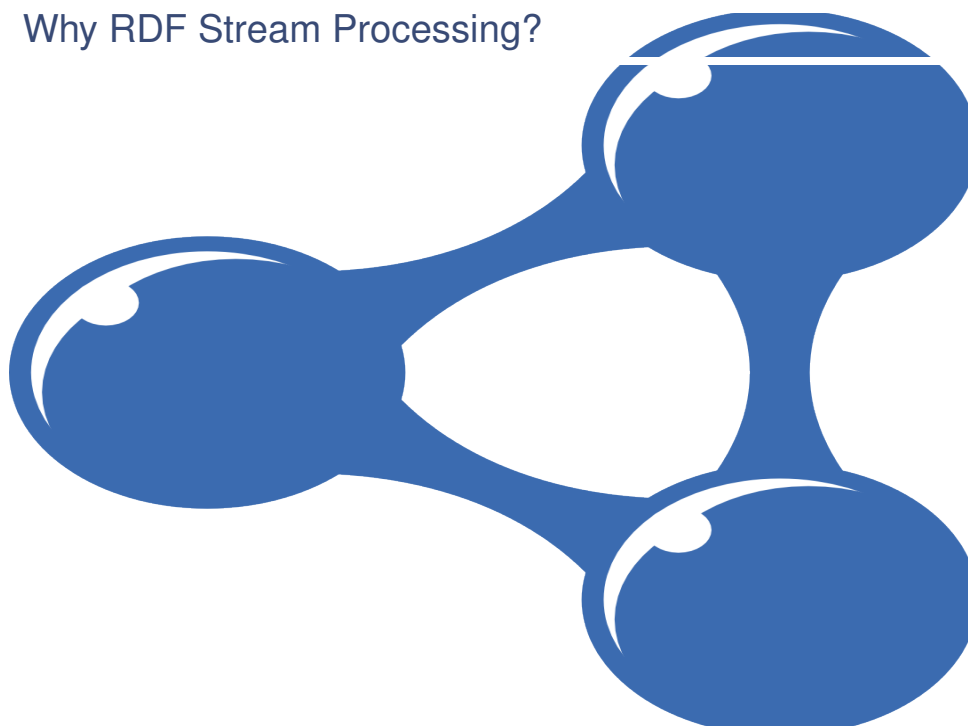
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Why RDF Stream Processing?



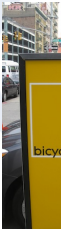
Interoperability



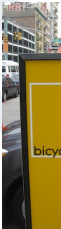
Interoperability



Interoperability

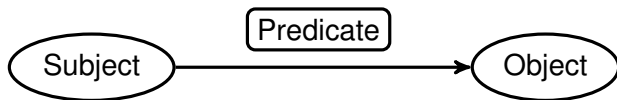


Interoperability

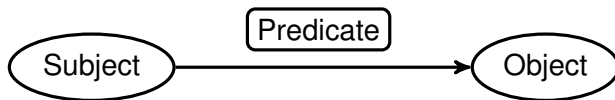


RDF

RDF

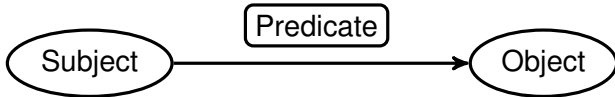


RDF



```
07290D3599E7A0D62097A346EFCC1FB5,  
2013-01-01 00:00:00,2013-01-01 00:02:00,  
-73.956528,40.716976,-73.962440,40.715008, 3.50,0.00
```

RDF



07290D3599E7A0D62097A346EFCC1FB5,
2013-01-01 00:00:00,2013-01-01 00:02:00,
-73.956528,40.716976,-73.962440,40.715008, 3.50,0.00

```
{  
:trip1 :taxi "07290D3599E7A0D62097A346EFCC1FB5".  
:trip1 :pickup_datetime "2013-01-01 00:00:00".  
:trip1 :dropoff_datetime "2013-01-01 00:02:00".  
:trip1 :pickLon -73.956528.  
:trip1 :pickLat 40.716976.  
:trip1 :dropLon -73.962440.  
:trip1 :dropLat 40.715008.  
:trip1 :fare 3.5.  
:trip1 :tip 0.0.  
}
```

SPARQL

SELECT

FROM

WHERE

SPARQL

SELECT

FROM `<http://example/taxi.rdf>`

WHERE

SPARQL

SELECT

FROM <http://example/taxi.rdf>

WHERE {

 ?trip :pickLon ?pLon. ?trip :pickLat ?pLat.

 ?trip :dropLon ?dLon. ?trip :dropLat ?dLat.

}

SPARQL

```
SELECT (ROUND((41.474937-?pLat)/0.005986) AS ?pE)
        (ROUND((74.913585+?pLon)/0.004491556) AS ?pS)
        (ROUND((41.474937-?dLat)/0.005986) AS ?dE)
        (ROUND((74.913585+?dLon)/0.004491556) AS ?dS)

FROM <http://example/taxi.rdf>
WHERE {
    ?trip :pickLon ?pLon.    ?trip :pickLat ?pLat.
    ?trip :dropLon ?dLon.    ?trip :dropLat ?dLat.
}
```

SPARQL

```
SELECT (ROUND((41.474937-?pLat)/0.005986) AS ?pE)
       (ROUND((74.913585+?pLon)/0.004491556) AS ?pS)
       (ROUND((41.474937-?dLat)/0.005986) AS ?dE)
       (ROUND((74.913585+?dLon)/0.004491556) AS ?dS)

FROM <http://example/taxi.rdf>
WHERE {
    ?trip :pickLon ?pLon.    ?trip :pickLat ?pLat.
    ?trip :dropLon ?dLon.    ?trip :dropLat ?dLat.
}

HAVING (?pE>0 && ?pE<301 && ?pS>0 && ?pS<301 &&
        ?dE>0 && ?dE<301 && ?dS>0 && ?dS<301)
```

SPARQL

```
SELECT (ROUND((41.474937-?pLat)/0.005986) AS ?pE)
       (ROUND((74.913585+?pLon)/0.004491556) AS ?pS)
       (ROUND((41.474937-?dLat)/0.005986) AS ?dE)
       (ROUND((74.913585+?dLon)/0.004491556) AS ?dS)
       (COUNT(?trip) AS ?freq)
FROM <http://example/taxi.rdf>
WHERE {
    ?trip :pickLon ?pLon.    ?trip :pickLat ?pLat.
    ?trip :dropLon ?dLon.    ?trip :dropLat ?dLat.
}
GROUP BY ?pE ?pS ?dE ?dS
HAVING (?pE>0 && ?pE<301 && ?pS>0 && ?pS<301 &&
        ?dE>0 && ?dE<301 && ?dS>0 && ?dS<301)
```


SPARQL

```
SELECT (ROUND((41.474937-?pLat)/0.005986) AS ?pE)
      (ROUND((74.913585+?pLon)/0.004491556) AS ?pS)
      (ROUND((41.474937-?dLat)/0.005986) AS ?dE)
      (ROUND((74.913585+?dLon)/0.004491556) AS ?dS)
      (COUNT(?trip) AS ?freq)
FROM <http://example/taxi.rdf>
WHERE {
    ?trip :pickLon ?pLon.    ?trip :pickLat ?pLat.
    ?trip :dropLon ?dLon.    ?trip :dropLat ?dLat.
}
GROUP BY ?pE ?pS ?dE ?dS
HAVING (?pE>0 && ?pE<301 && ?pS>0 && ?pS<301 &&
        ?dE>0 && ?dE<301 && ?dS>0 && ?dS<301)
ORDER BY ?freq
LIMIT 10
```

SPARQL

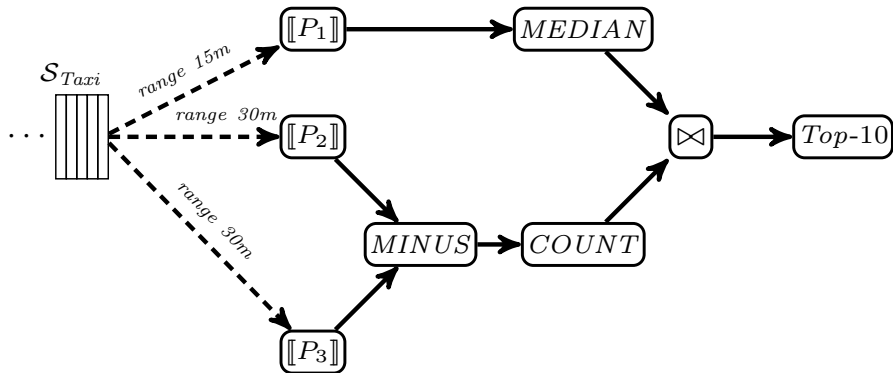
```
SELECT (ROUND((41.474937-?pLat)/0.005986) AS ?pE)
       (ROUND((74.913585+?pLon)/0.004491556) AS ?pS)
       (ROUND((41.474937-?dLat)/0.005986) AS ?dE)
       (ROUND((74.913585+?dLon)/0.004491556) AS ?dS)
       (COUNT(?trip) AS ?freq)
FROM <http://example/taxi.rdf>
WHERE {
    ?trip :pickLon ?pLon.    ?trip :pickLat ?pLat.
    ?trip :dropLon ?dLon.    ?trip :dropLat ?dLat.
}
GROUP BY ?pE ?pS ?dE ?dS
HAVING (?pE>0 && ?pE<301 && ?pS>0 && ?pS<301 &&
        ?dE>0 && ?dE<301 && ?dS>0 && ?dS<301)
ORDER BY ?freq
LIMIT 10
```

{ {?pE ↦ 127, ?pS ↦ 213, ?dE ↦ 127, ?dS ↦ 212, ?freq ↦ 1} } .

RSP Queries in CQELS

```
SELECT (ROUND((41.474937-?pLat)/0.005986) AS ?pE)
      (ROUND((74.913585+?pLon)/0.004491556) AS ?pS)
      (ROUND((41.474937-?dLat)/0.005986) AS ?dE)
      (ROUND((74.913585+?dLon)/0.004491556) AS ?dS)
      (COUNT(?trip) AS ?freq)
WHERE {
  STREAM <Taxi> [RANGE 30 minutes] {
    ?trip :pickLon ?pLon.    ?trip :pickLat ?pLat.
    ?trip :dropLon ?dLon.    ?trip :dropLat ?dLat.
  }
}
GROUP BY ?pE ?pS ?dE ?dS
HAVING (?pE>0 && ?pE<301 && ?pS>0 && ?pS<301 &&
        ?dE>0 && ?dE<301 && ?dS>0 && ?dS<301)
ORDER BY ?freq
LIMIT 10
```

Query Plan of Q_2



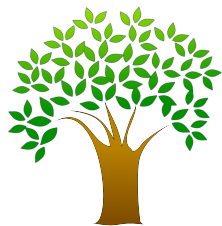
CQELS Solutions for the Grand Challenge

CQELS Solutions for the Grand Challenge



High Performance Data Structures

CQELS Solutions for the Grand Challenge

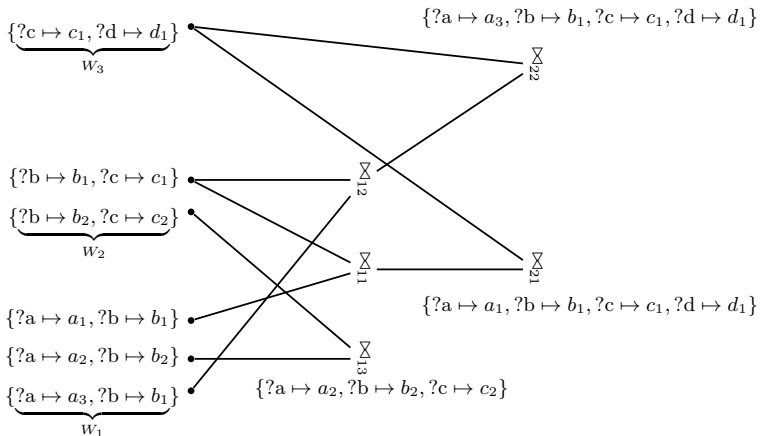


High Performance Data Structures

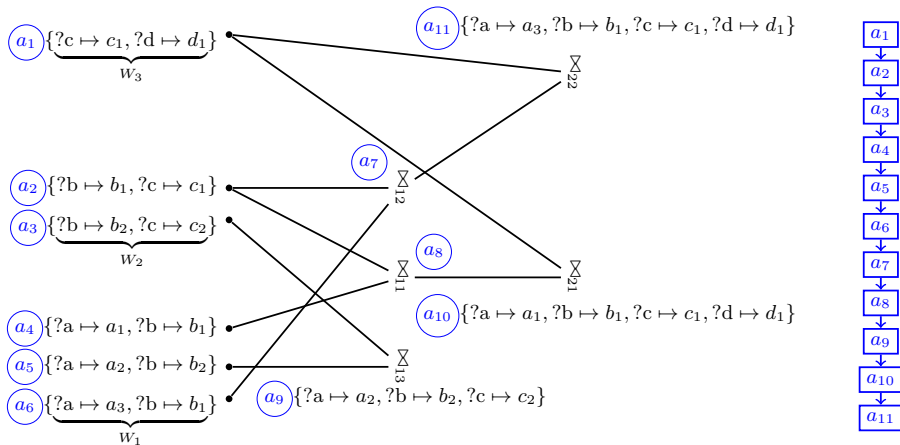


Incremental Algorithms

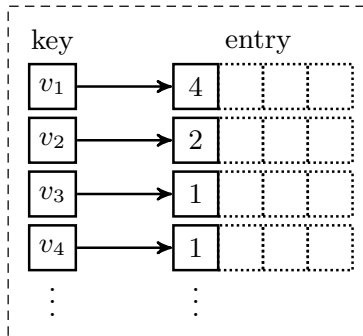
Tree-based Data Structures



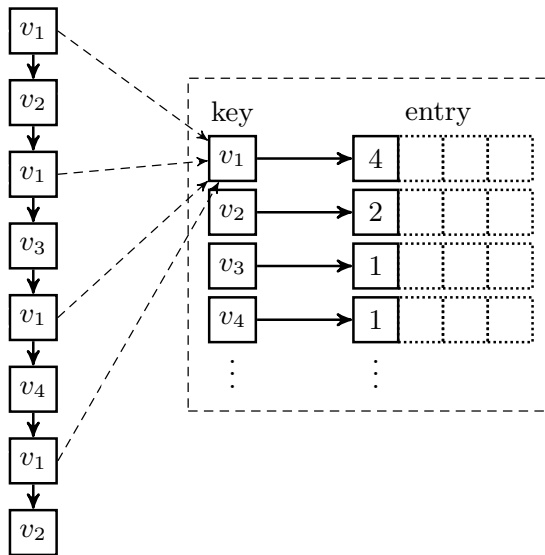
Input Buffers



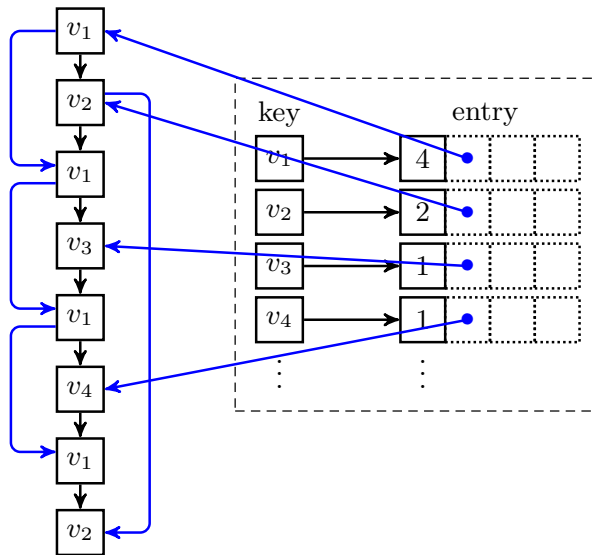
Indexed Buffers



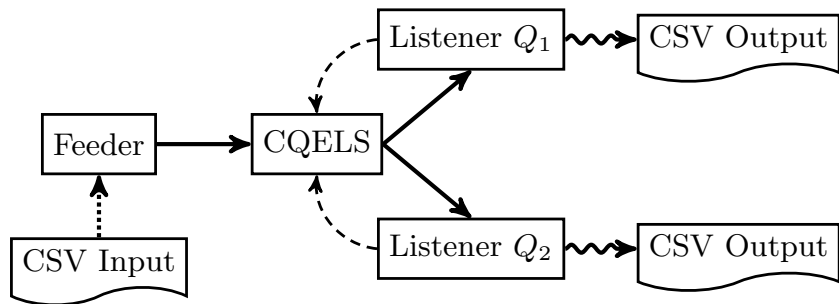
One-way Index



Ring Index



Deployment and Tests



query registration - - - - ->

read CSV lines>

RDF stream ———>

write CSV output ~~~~~>

Compare CQELS to a Base-line System

	Avg. delay time (ms)				Exe. time (s)		
	Indv.		Mixed		Indv.		Mixed
	Q_1	Q_2	Q_1	Q_2	Q_1	Q_2	Q_1 & Q_2
C	0.022	0.068	0.023	0.075	65.77	69.02	76.64
B	5	194	174	220	5000	22000	28000

Delay time (per output):

right after reading the input → right before writing the output

Execution time:

first input line read → final output streamed out

Compare CQELS to a Base-line System

	Avg. delay time (ms)				Exe. time (s)		
	Indv.		Mixed		Indv.		Mixed
	Q_1	Q_2	Q_1	Q_2	Q_1	Q_2	$Q_1 \& Q_2$
C	0.022	0.068	0.023	0.075	65.77	69.02	76.64
B	5	194	174	220	5000	22000	28000

Delay time (per output):

right after reading the input → right before writing the output

Execution time:

first input line read → final output streamed out

Exp: vary window sizes

Compare CQELS to a Base-line System

	Avg. delay time (ms)				Exe. time (s)		
	Indv.		Mixed		Indv.		Mixed
	Q_1	Q_2	Q_1	Q_2	Q_1	Q_2	Q_1 & Q_2
C	0.022	0.068	0.023	0.075	65.77	69.02	76.64
B	5	194	174	220	5000	22000	28000

Delay time (per output):

right after reading the input → right before writing the output

Execution time:

first input line read → final output streamed out

Exp: vary window sizes → no change in average delay time!

Conclusions

RDF Stream Processing for the DEBS 2015 Grand Challenge

Techniques implemented in CQELS

- ▶ High performance data structures
- ▶ Incremental algorithms (details in paper)

Experimental results

- ▶ Comparison to a base-line system
- ▶ Experiment on varying window sizes