

Fast Processing of SPARQL Queries on RDF Quadruples

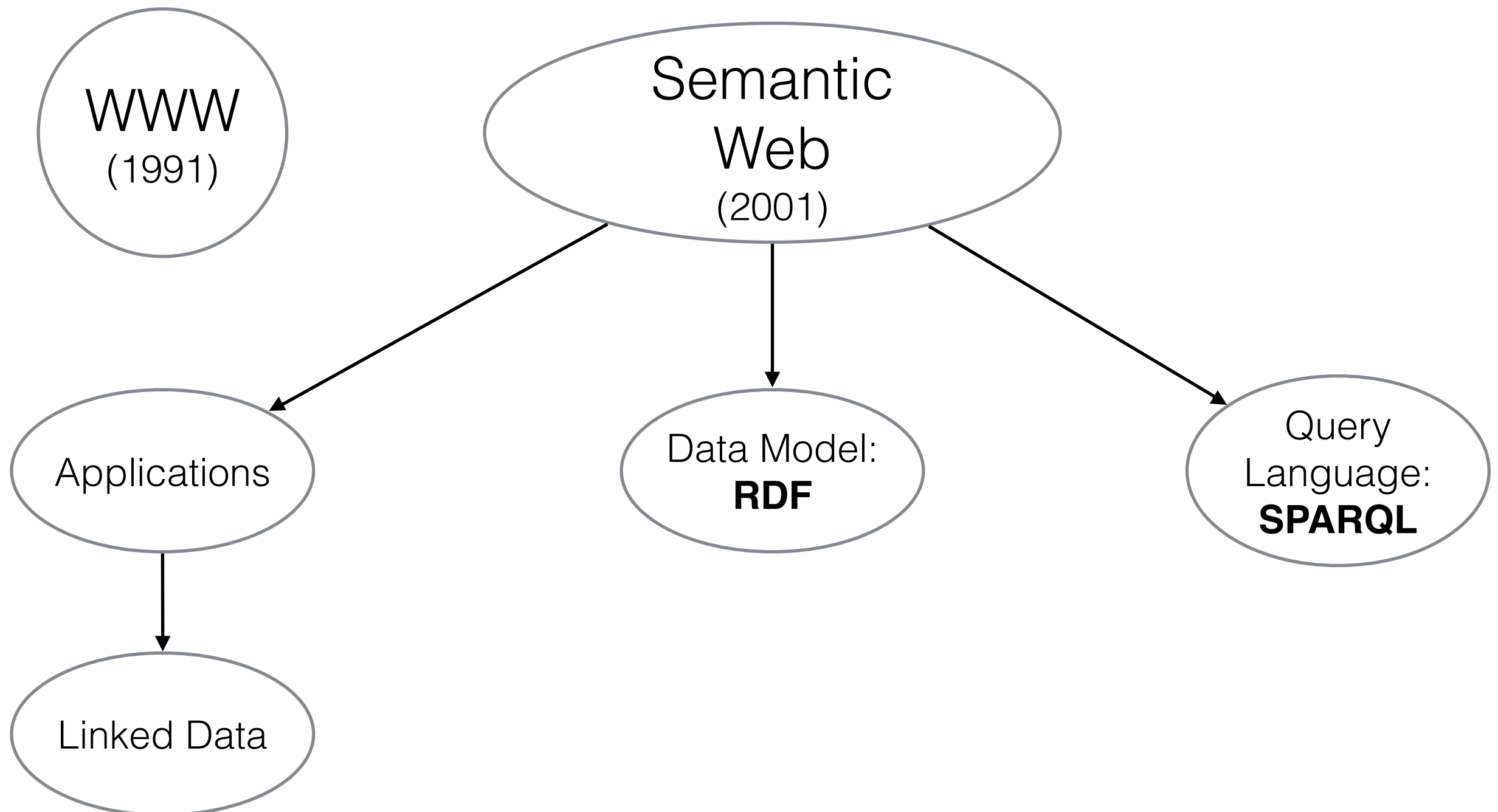
Vasil Slavov, Anas Katib, Praveen Rao,
Srivenu Paturi, Dinesh Barenkala
University of Missouri-Kansas City

WebDB 2014

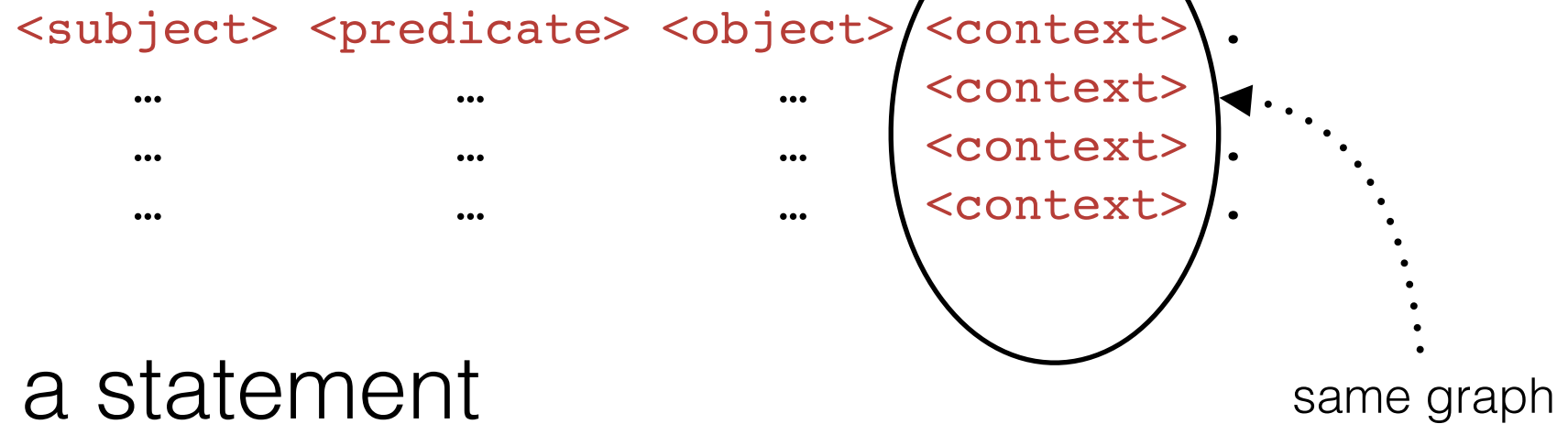
Acknowledgements

National Science Foundation (IIS-1115871)

Semantic Web



Quads



- Origin of a statement

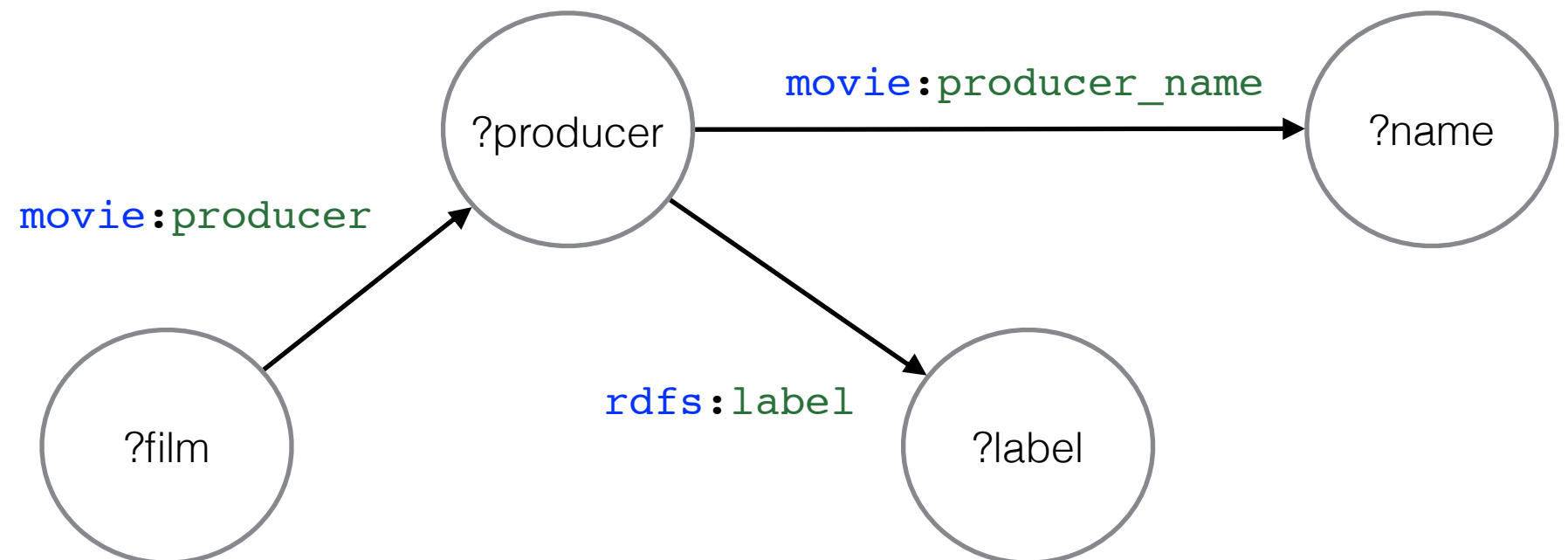
```
1 foaf:me foaf:name "Alice" <http://ex.org/alice/foaf.rdf> .
2 foaf:me foaf:name "Bob" <http://ex.org/bob/foaf.rdf> .
```

- Differentiate b/w identical statements

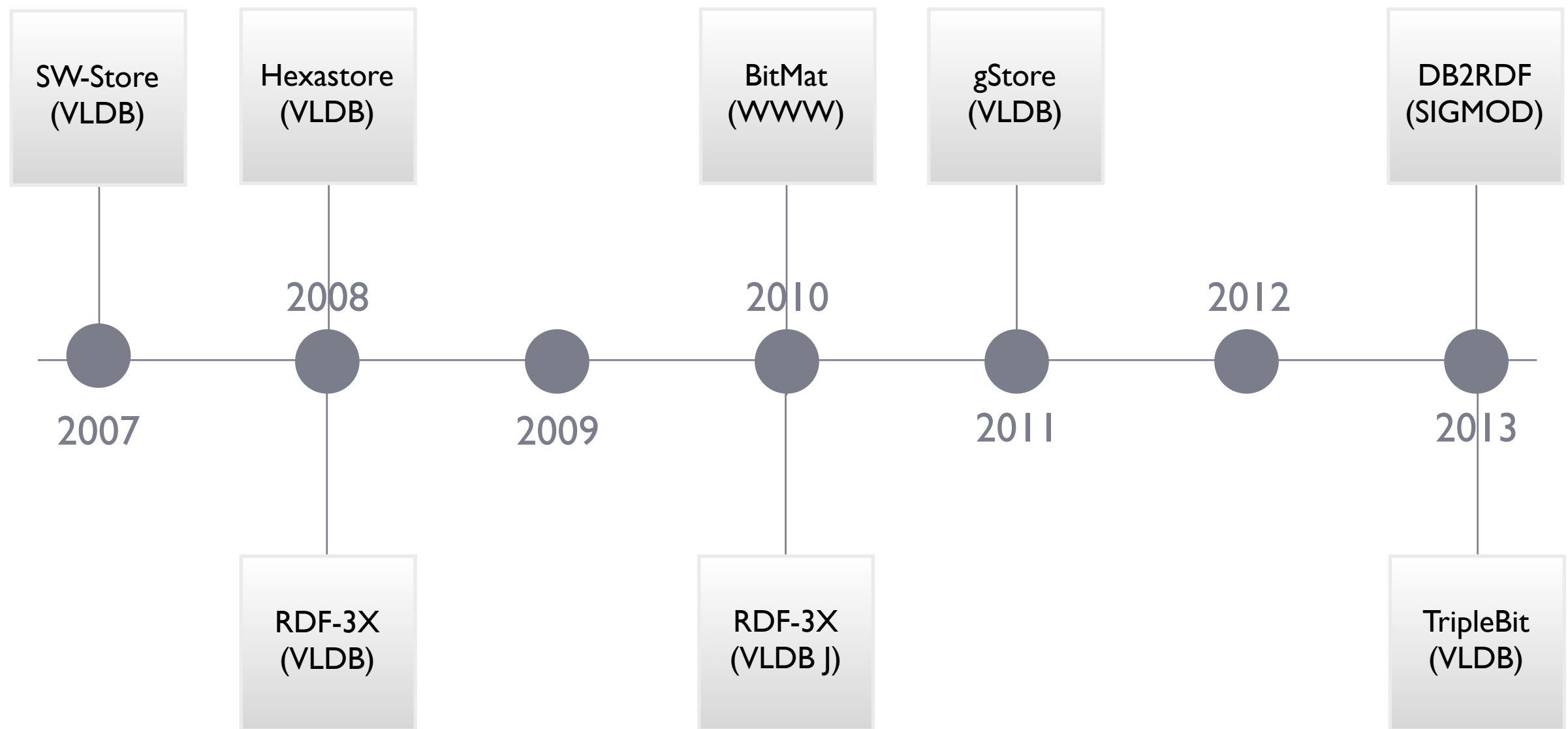
```
1 foaf:alice foaf:knows foaf:bob <http://ex.org/graphs/john> .
2 foaf:alice foaf:knows foaf:bob <http://ex.org/graphs/james> .
```

GRAPH query

```
1 PREFIX rdfs: <http://www.w3.org/2000/01/rdf-schema#>
2 PREFIX foaf: <http://xmlns.com/foaf/0.1/>
3 PREFIX movie: <http://data.linkedmdb.org/resource/movie/>
4
5 SELECT ?g ?producer ?name ?label ?page ?film WHERE {
6   GRAPH ?g {
7     ?producer movie:producer_name ?name .
8     ?producer rdfs:label ?label .
9     ?film movie:producer ?producer .
10  }
11 }
```



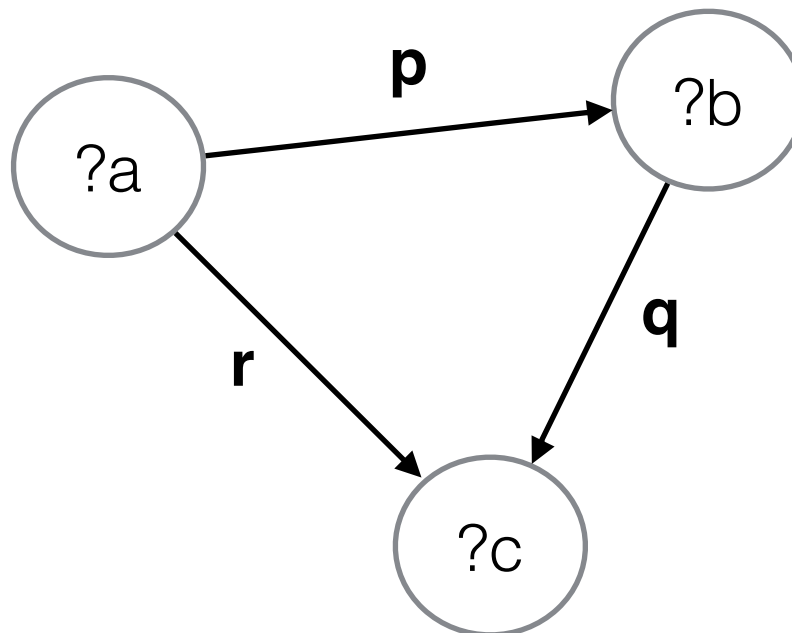
Related work



What's missing in them?

1. No support for quads
2. No large BGP queries (over 8 triple patterns)
3. No complex BGP queries (undirected cycles):

```
1 SELECT * WHERE {  
2   ?a p ?b .  
3   ?b q ?c .  
4   ?a r ?c .  
5 }
```



Why not use triple stores for
quads?

INCORRECT RESULTS

Triple vs. Quad

```
1 <a> <b> <c> <g1> .  
2 <a> <b> <e> <g2> .
```

<a>

Data

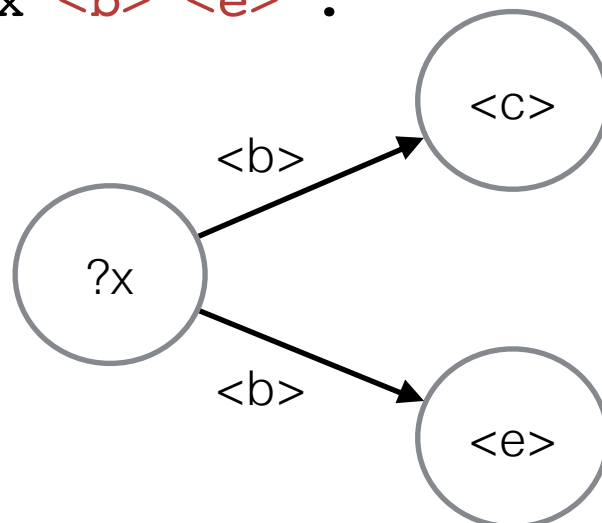
Triple store results

Query

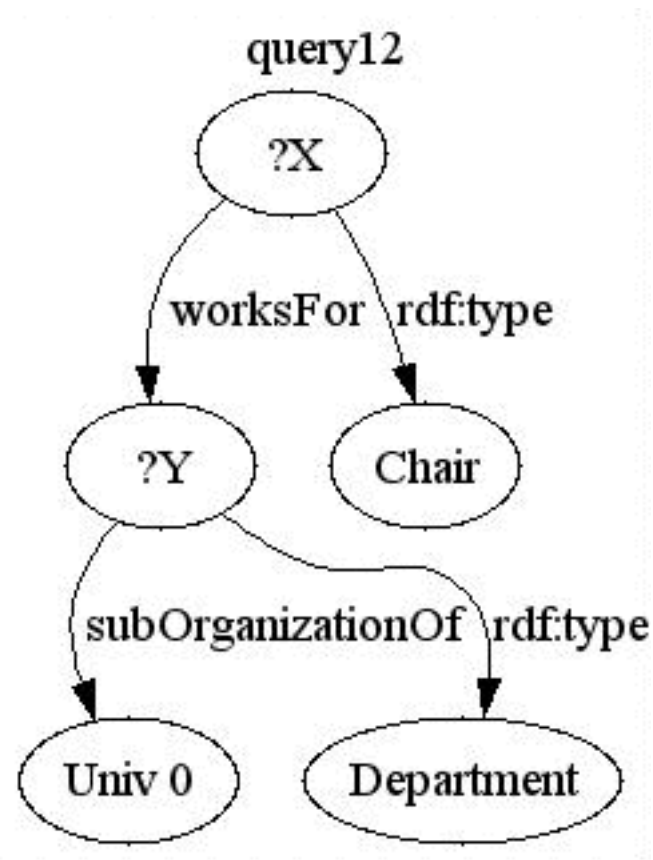
Quad store results

```
1 SELECT ?x WHERE {  
2   GRAPH ?g {  
3     ?x <b> <c> .  
4     ?x <b> <e> .  
5   }  
6 }
```

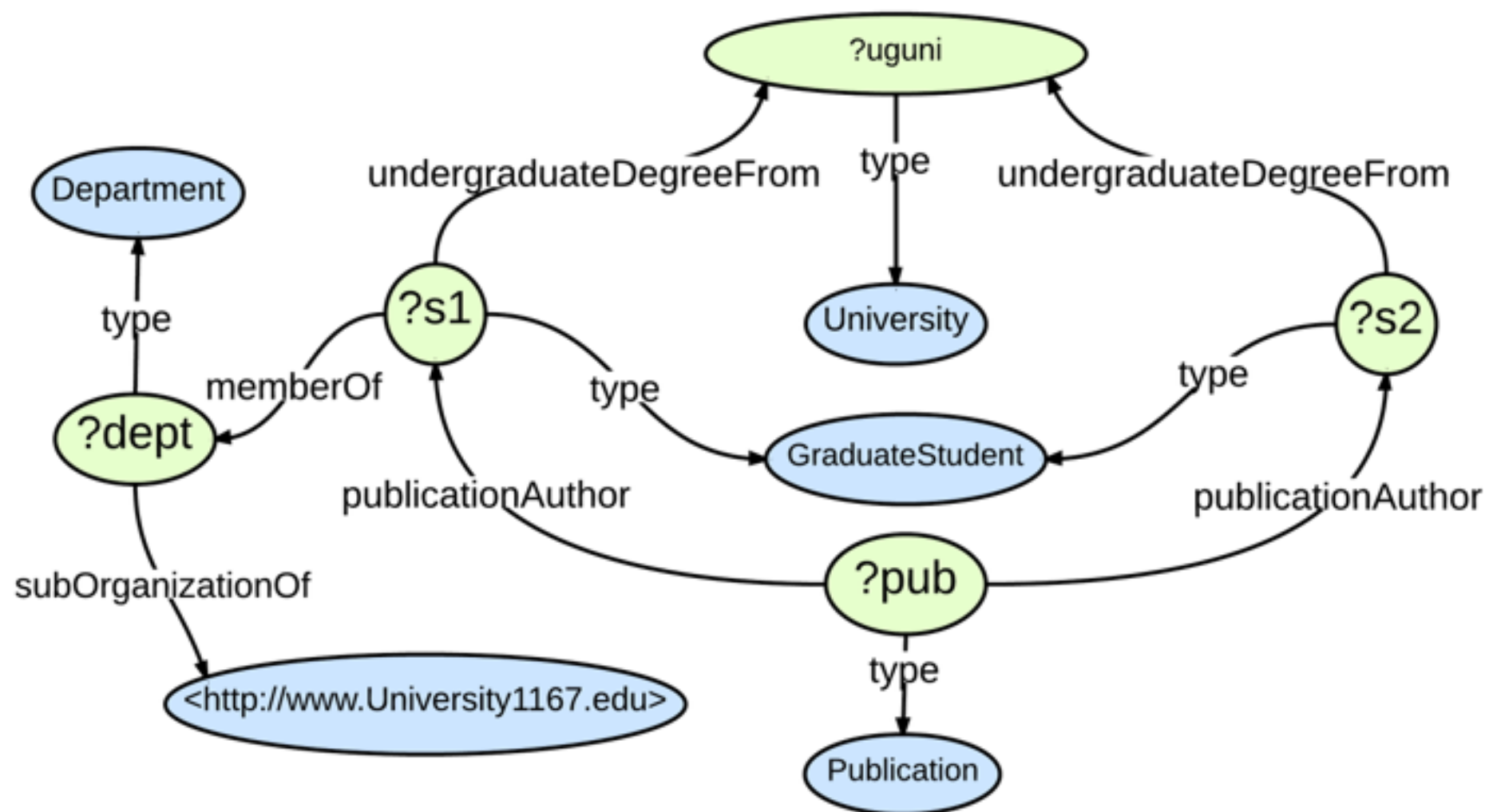
<empty>



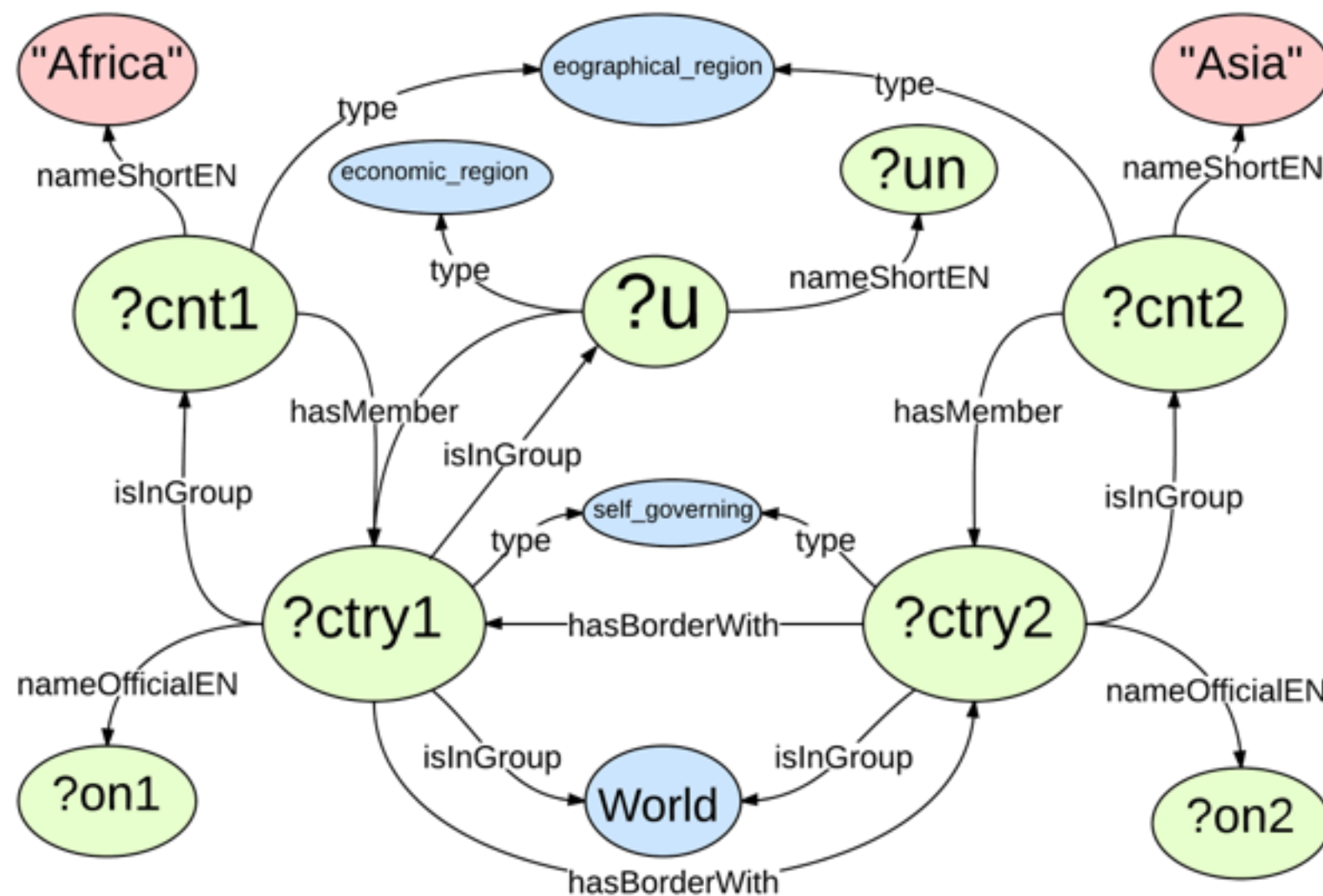
State-of-the-art technologies are... fast



State-of-the-art technologies
are... **slow**



State-of-the-art technologies
are... really slow

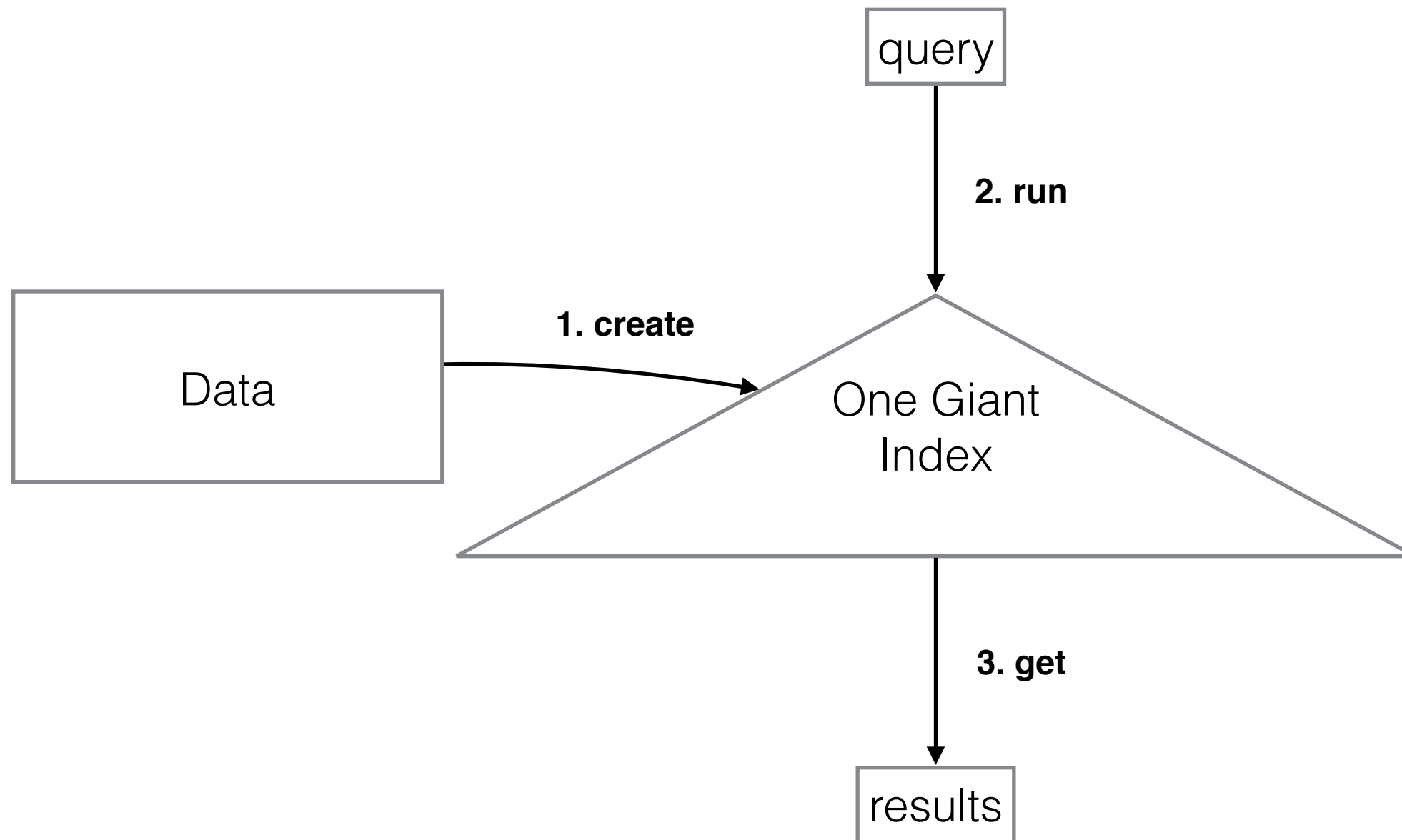


Comparison

	quads	max triples/ quads	max triple patterns
RIQ	yes	1.38B	22
RDF-3X	no	845M	13
BitMat	no	1.33B	8
Jena TDB	yes	333M	6
DB2RDF	no	333M	6
TripleBit	no	2.95B	12

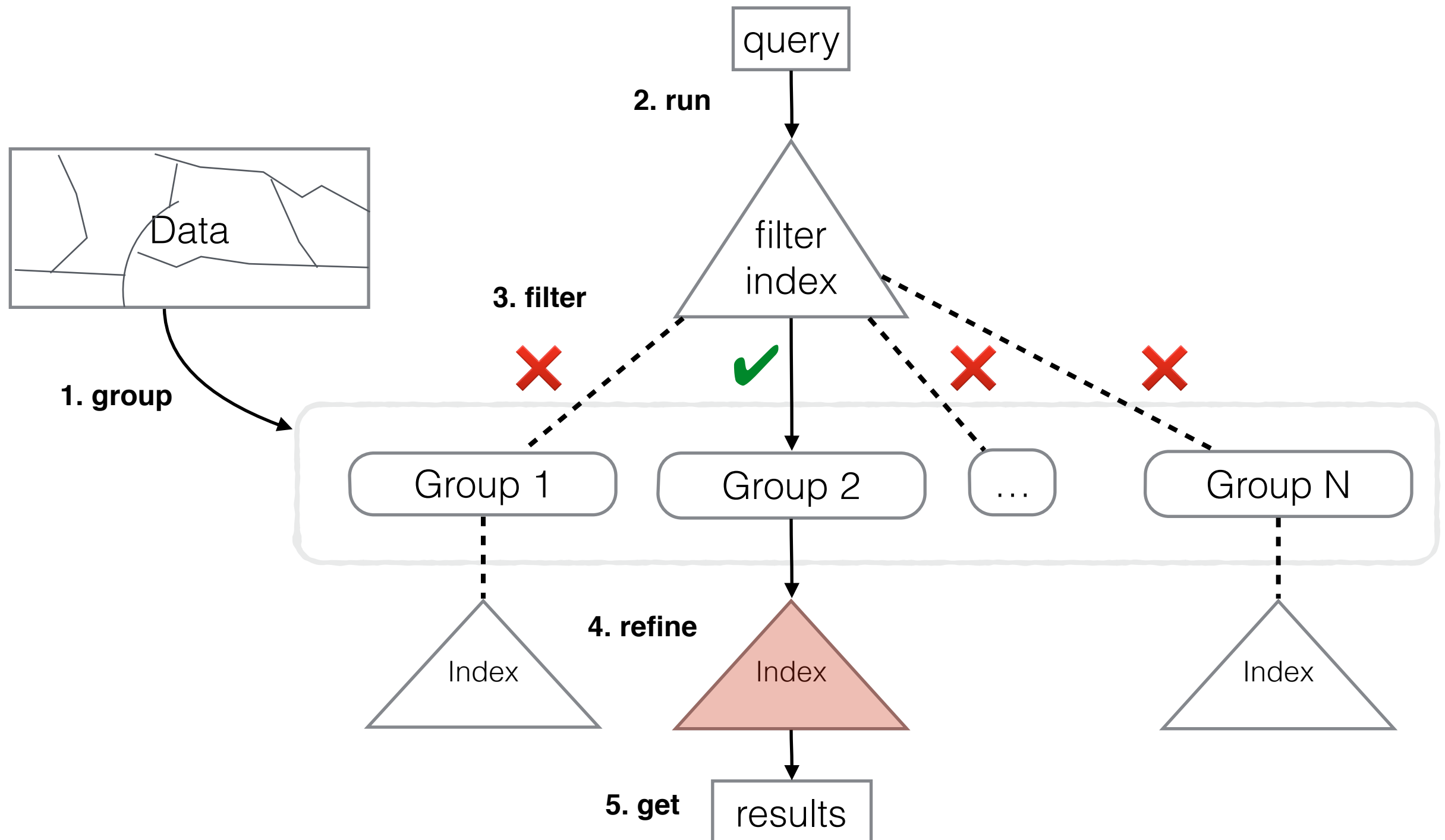
Query processing

(traditional)

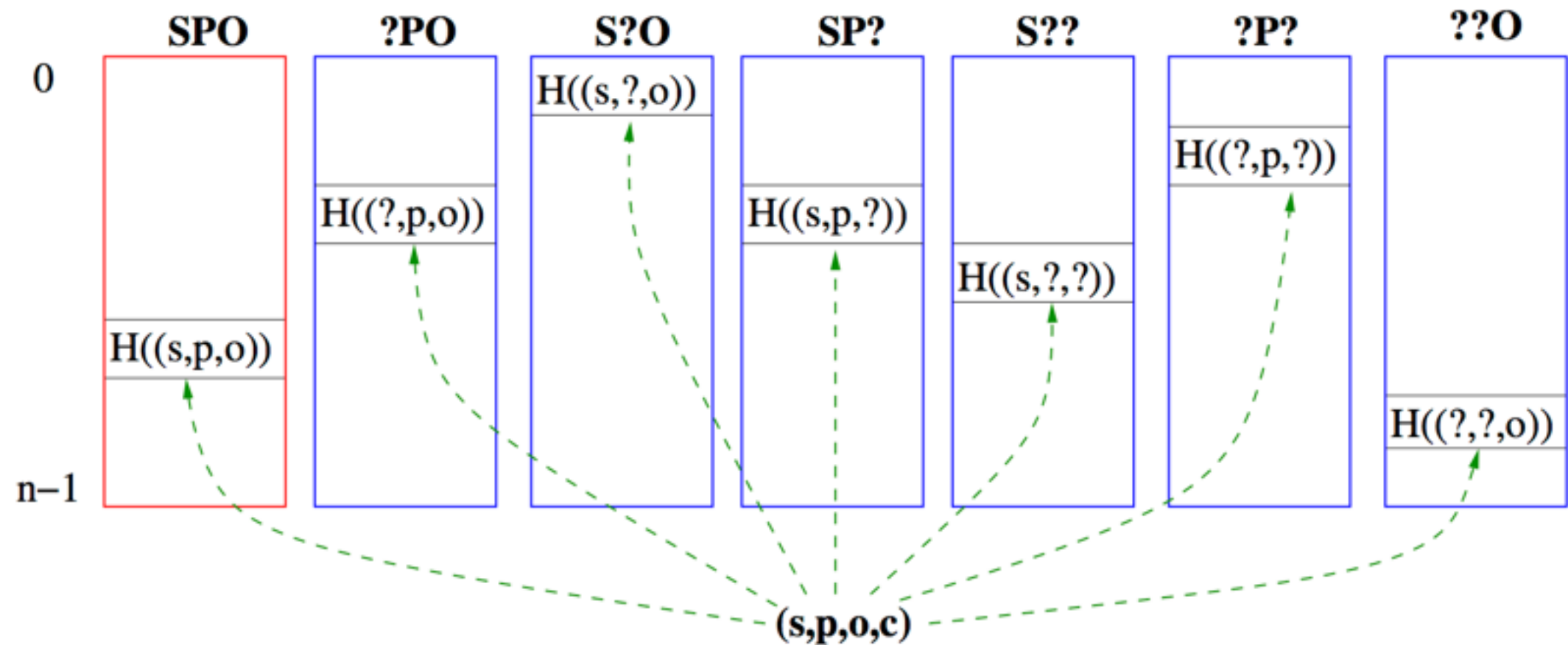


Query processing

(our 'decrease-and-conquer' approach)



Pattern Vectors (PVs)



$$\mathbb{H} : B \rightarrow \mathbb{Z}^*$$

$$\mathbb{P} = \{SPO, SP?, S?O, ?PO, S??, ?P?, ??O\}$$

Filter Index construction

Steps:

1. Create groups of similar PVs

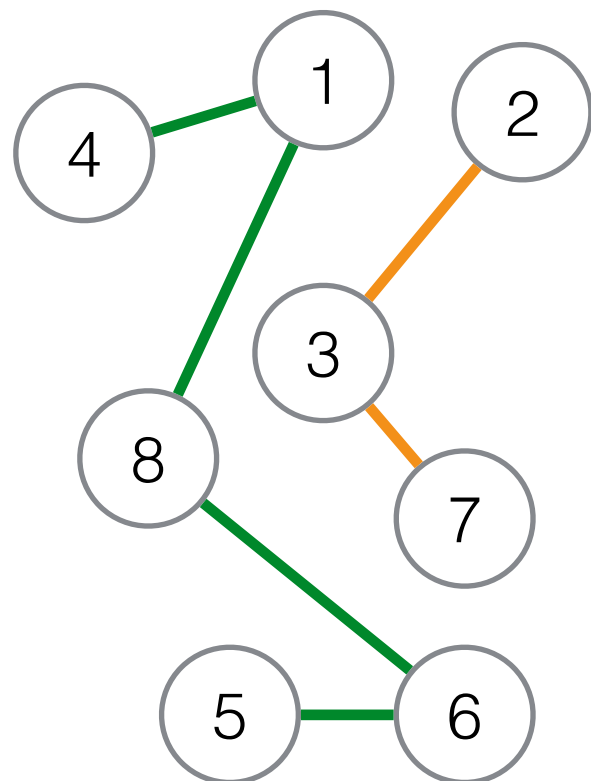
Locality Sensitive Hashing

2. Compactly store Filter Index

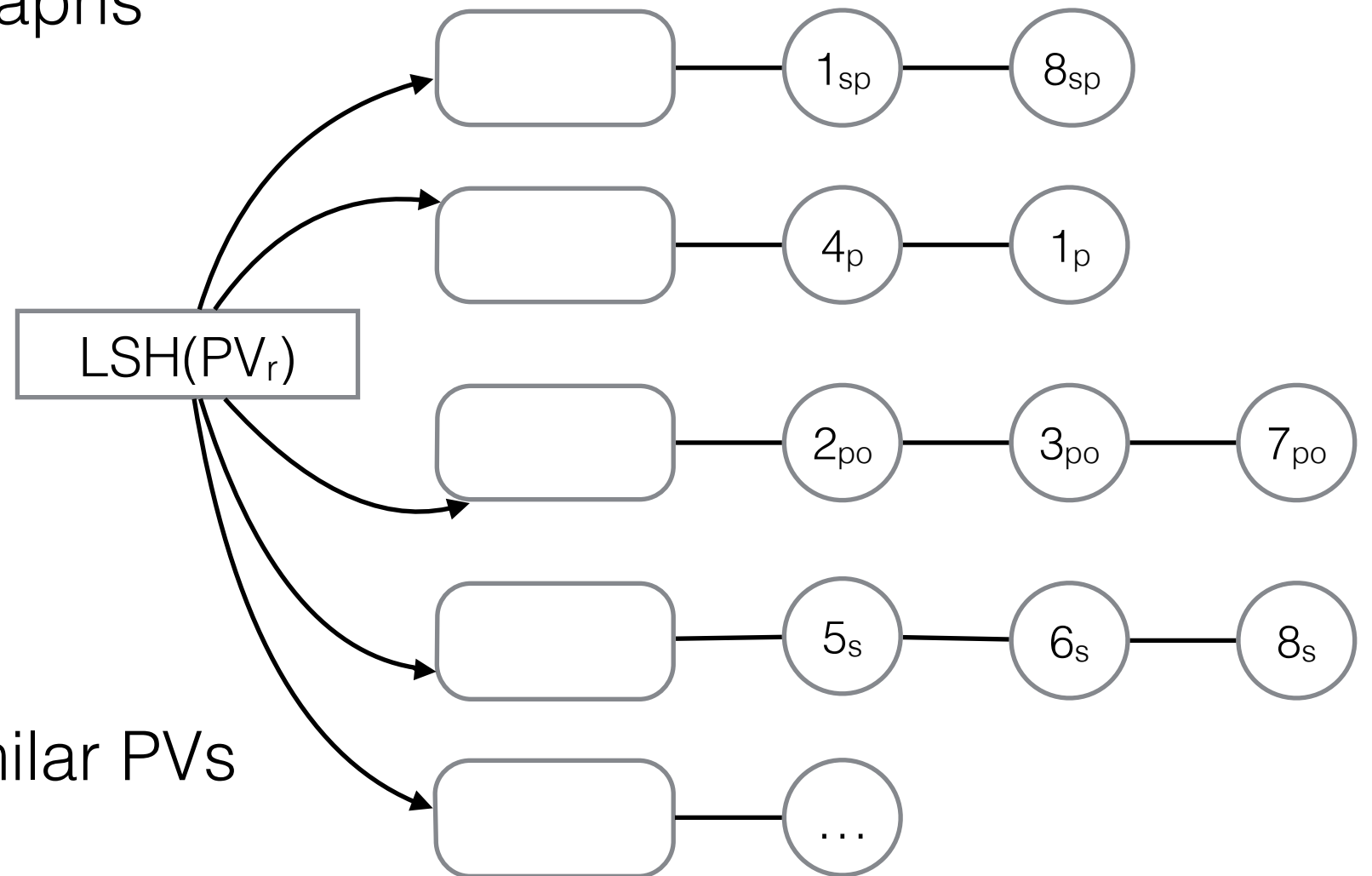
Bloom Filters and Counting Bloom Filters

Grouping PVs

Input: list of PVs of graphs



Output: groups of similar PVs



$$sim(PV_a, PV_b) = \max_{r \in \mathbb{P}} \frac{|PV_{a,r} \cap PV_{b,r}|}{|PV_{a,r} \cup PV_{b,r}|}$$

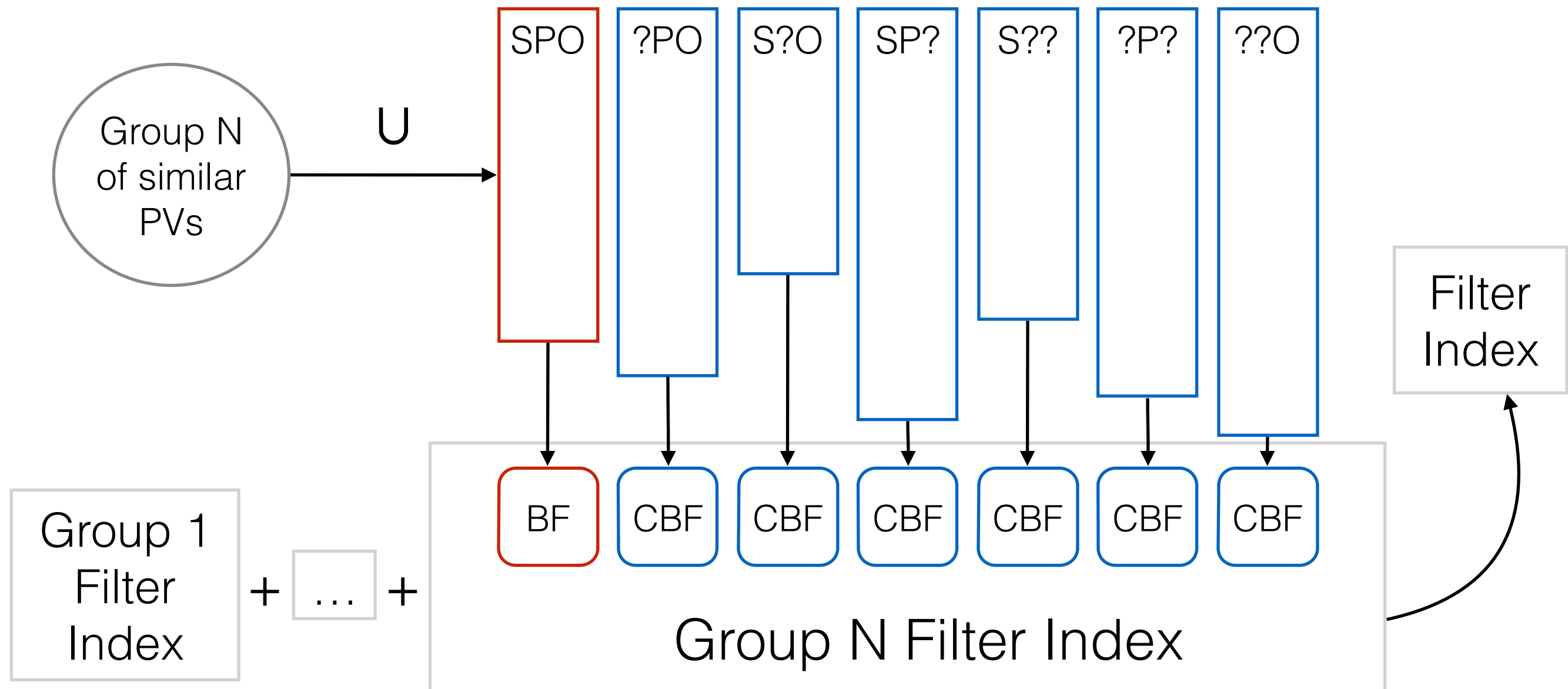
$$\mathbb{P} = \{SPO, SP?, S?O, ?PO, S??., ?P?, ??O\}$$

Filter Index

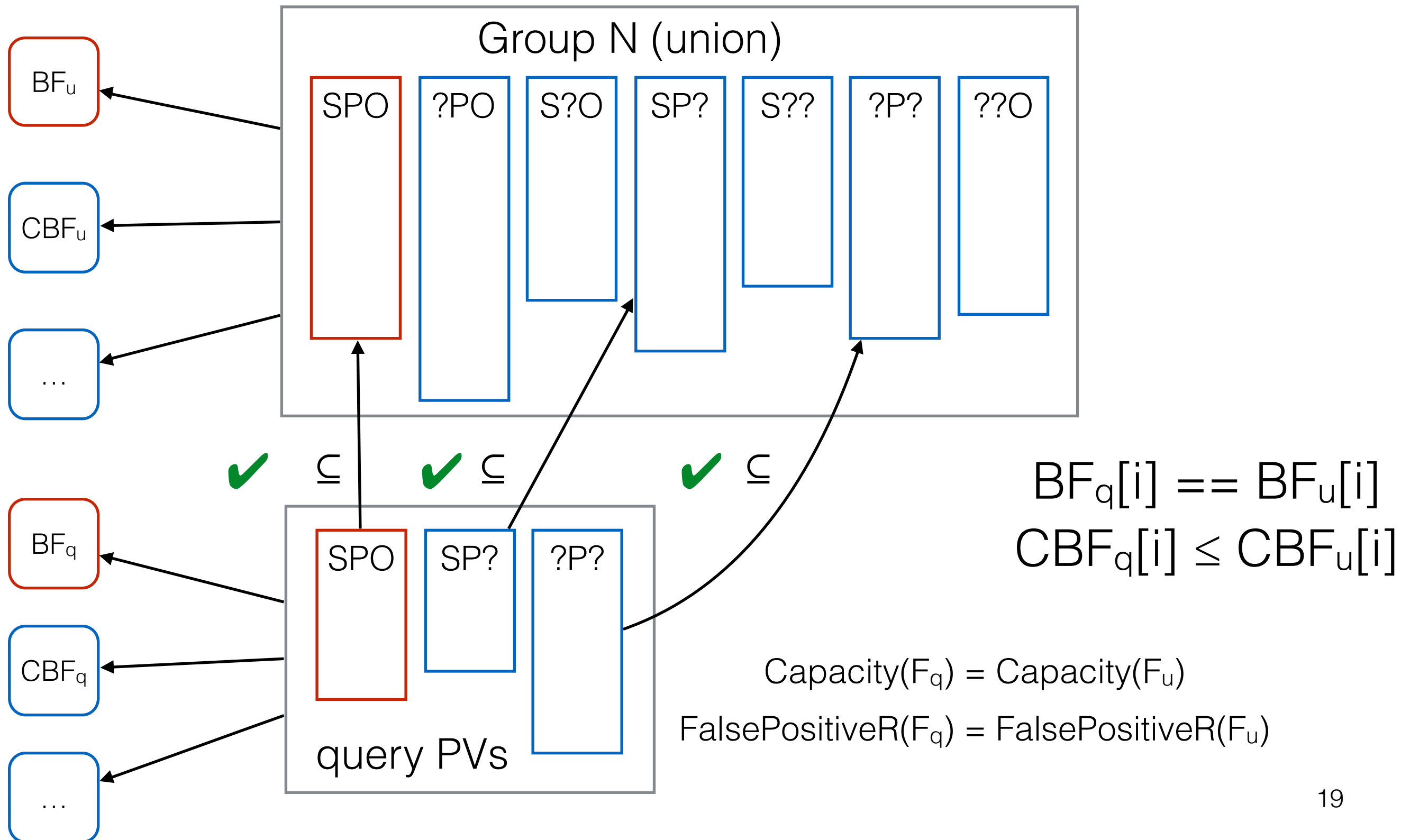
$$PV_{c,r} \leftarrow PV_{a,r} \cup PV_{b,r} \text{ and } r \in \mathbb{P}$$

$$\mathbb{P} = \{SPO, SP?, S?O, ?PO, S??, ?P?, ??O\}$$

Group N (union)



Query execution



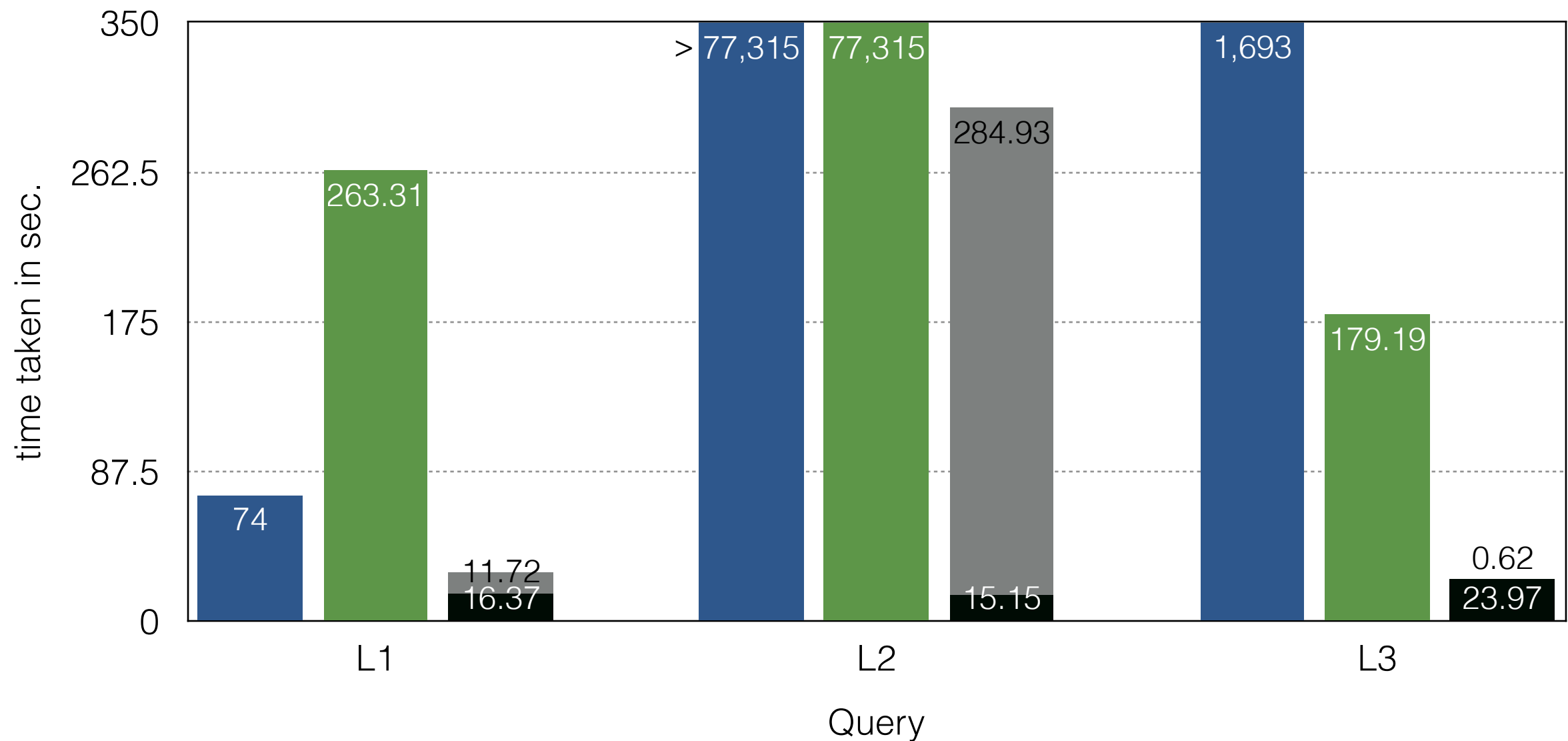
Initial performance evaluation

- Datasets
 - Synthetic: LUBM [[Web Semantics '05](#)], 1.38 billion triples
 - Real: BTC-2012 [<http://challenge.semanticweb.org>], 1.36 billion quads
- Queries with single BGP
 - Large: up to 22 patterns
 - Small: up to 8 patterns

Large BGPs

(LUBM, cold cache)

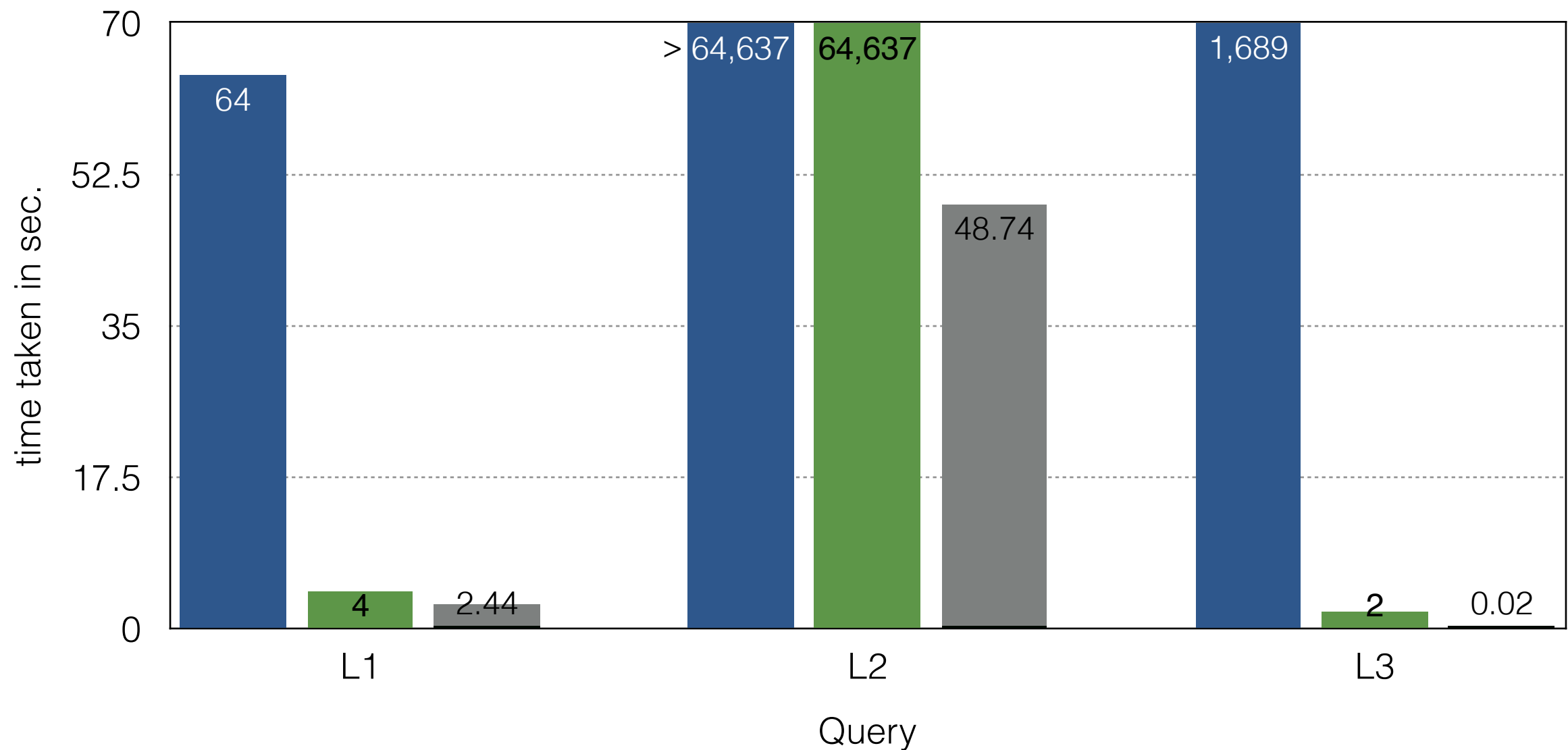
■ RDF-3X ■ Jena TDB ■ RIQ: filter ■ RIQ: refine



Large BGPs

(LUBM, warm cache)

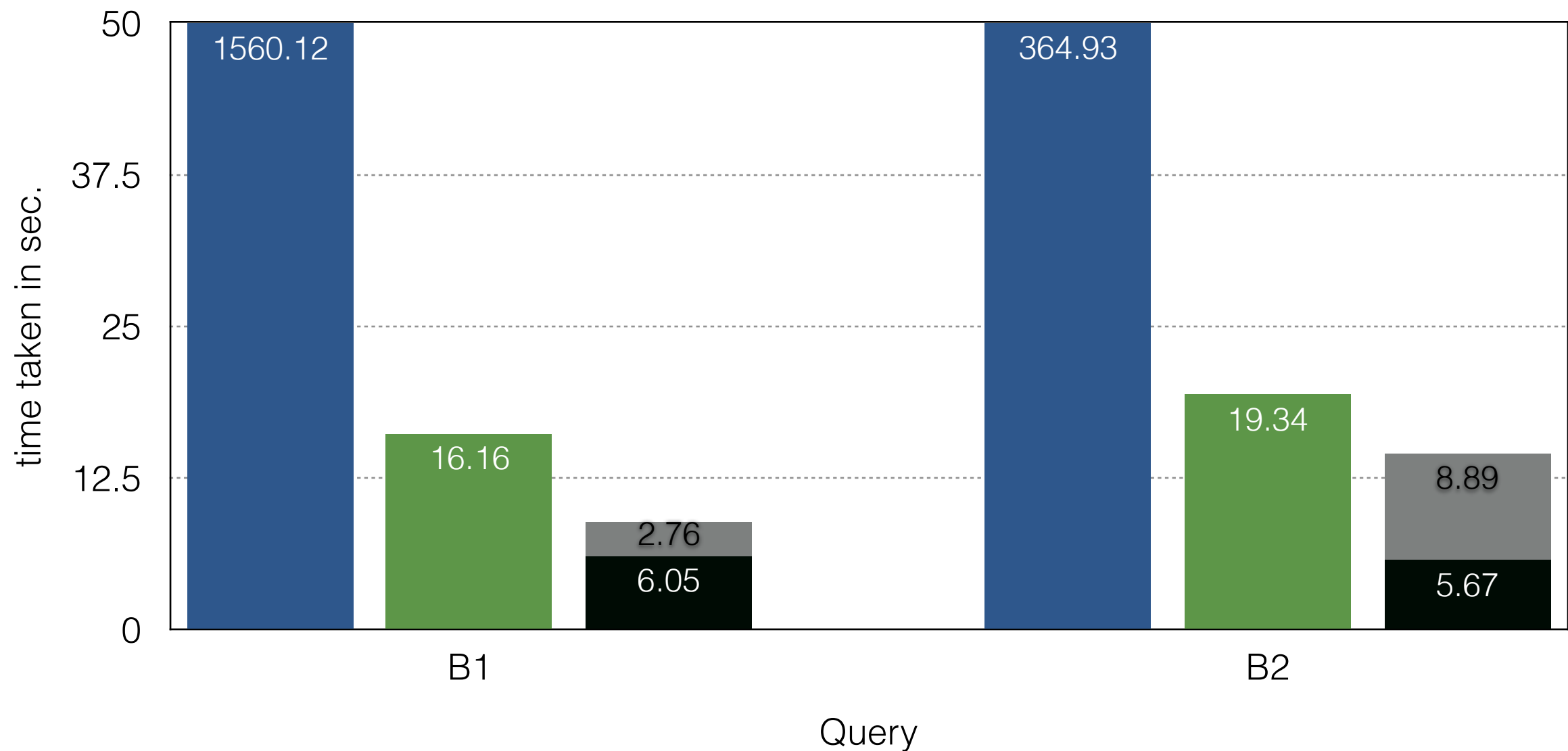
■ RDF-3X ■ Jena TDB ■ RIQ: filter ■ RIQ: refine



Large BGPs

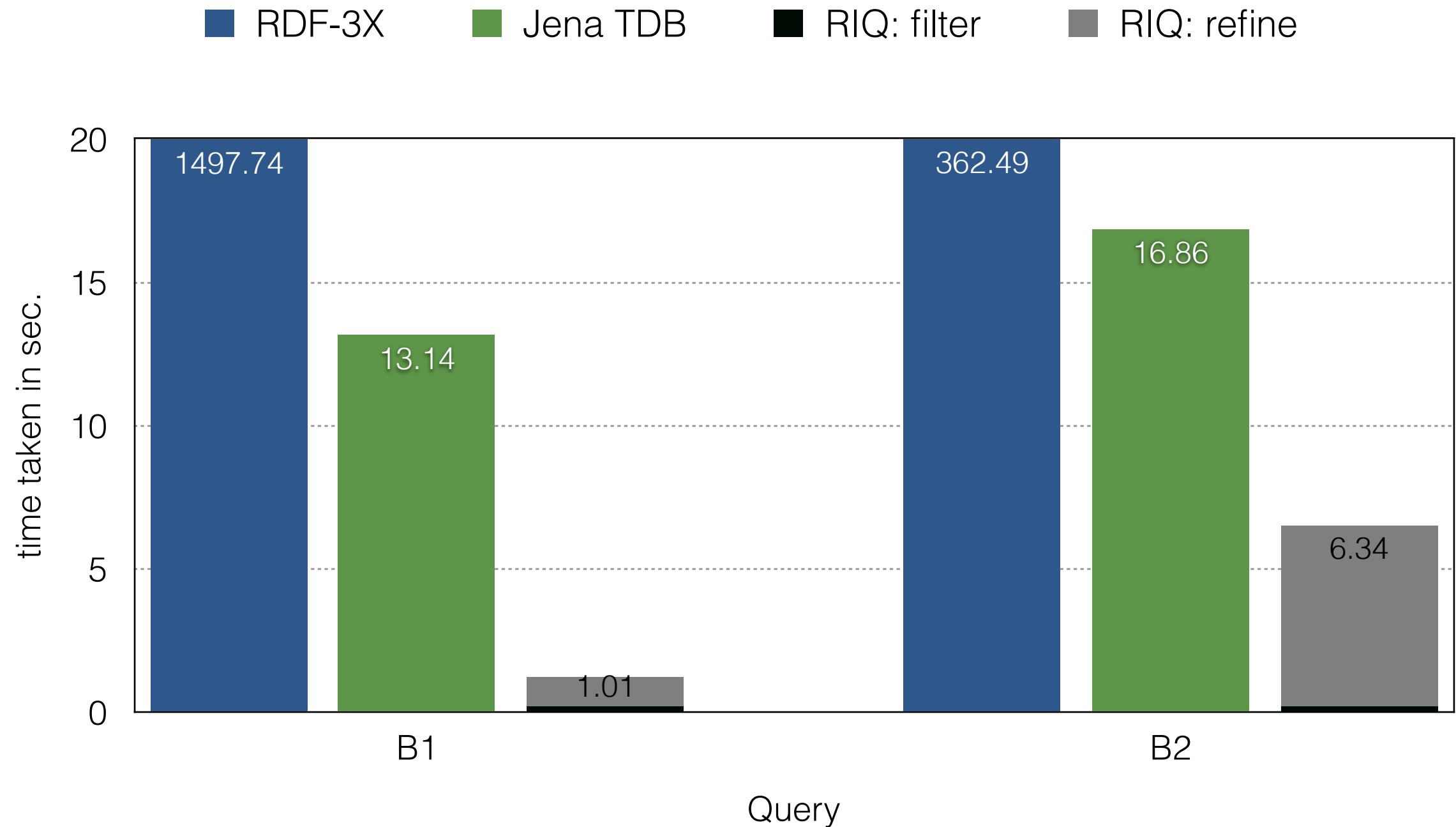
(BTC-2012, cold cache)

■ RDF-3X ■ Jena TDB ■ RIQ: filter ■ RIQ: refine



Large BGPs

(BTC-2012, warm cache)



Small BGPs

(LUBM)

	Cold cache			⋮	Warm cache		
Query	RIQ	RDF-3X	Jena TDB	⋮	RIQ	RDF-3X	Jena TDB
L4	229.95	1986.21	698.08	⋮	27.46	1899.1	664.75
L5	576.96	995.26	1130.43	⋮	567.2	948.53	1127.37
L6	506.93	888.84	1119.31	⋮	489.36	847.59	1144.11
L7	892.7	1215.53	aborted	⋮	871.12	1153.31	aborted
L8	507.43	805.41	1346.17	⋮	497.69	70.35	1395.48
L9	538.99	979.79	1137.38	⋮	519.22	947.07	1142.73
L10	18.72	11.11	7.15	⋮	0.51	6.39	3.19
L11	12.19	1.98	5.79	⋮	0.41	0.25	1.13
L12	103.14	22.33	725.93	⋮	26.76	19.83	703.26
Geo. mean	193.85	210.97	282.57	⋮	59.68	115.7	207.72

Small BGPs

(BTC-2012)

	Cold cache				Warm cache		
Query	RIQ	RDF-3X	Jena TDB		RIQ	RDF-3X	Jena TDB
B3	41.01	56.42	373.59		1.83	0.82	20.13
B4	42.17	48.55	321.56		3.59	2.37	35.99
B5	70.15	74.86	3541.99		32.38	28.64	3540.28
B6	20.39	> 40,140	14.89		0.64	> 40,140	12.83
B7	221.86	210.37	1925.27		184.86	118.84	1817.85
Geo. mean	55.96	280.34	414.25		7.59	48.4	143.01

Queries with multiple BGPs

- Keywords like UNION, EXISTS, OPTIONAL, etc.
- See paper for more details

Q&A

Acknowledgements:

- National Science Foundation (IIS-1115871)