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# OntoQuad: Native High-Speed RDF DBMS for Semantic Web

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# OntoQuad General Information

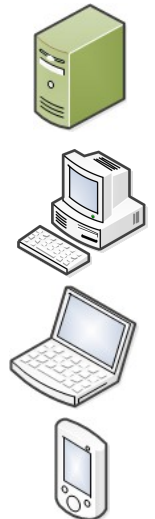


## OntoQuad

- Is developed with the latest **C++** Standard (**C++11**) from zero
- is compliant with the latest standards of the W3C (e.g. **RDF**, **SPARQL 1.1**)
- supports Java (**Jena**) **API**
- works in **transactional** mode

**OntoQuad is cross-platform** and can be deployed on different devices:

- MS Windows x64 (developed on Windows 7)
- Unix/Linux x64 (tested on Linux CentOS 6.3)
- Mobile Android (Samsung Galaxy Note II, Google Nexus 7 etc.)
- Raspberry Pi Model B rev 2
- iOS & OS X – is coming soon





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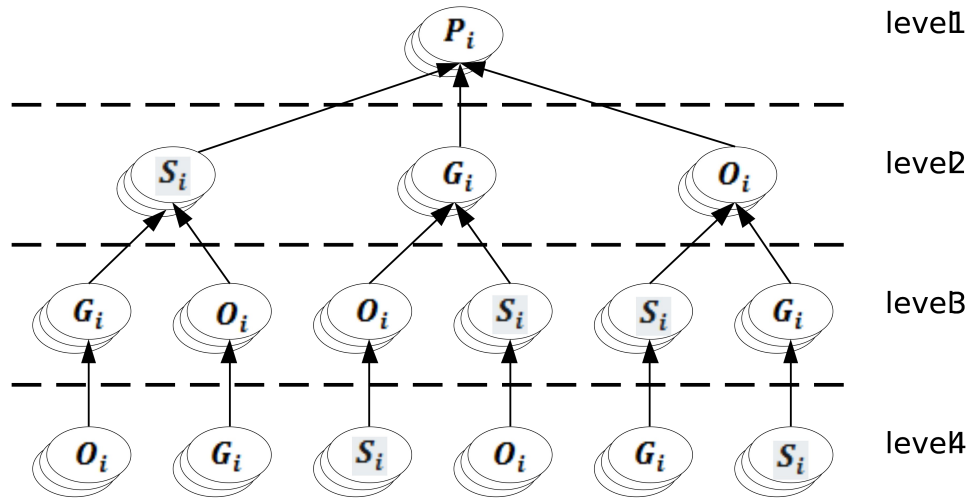
# Information Architecture



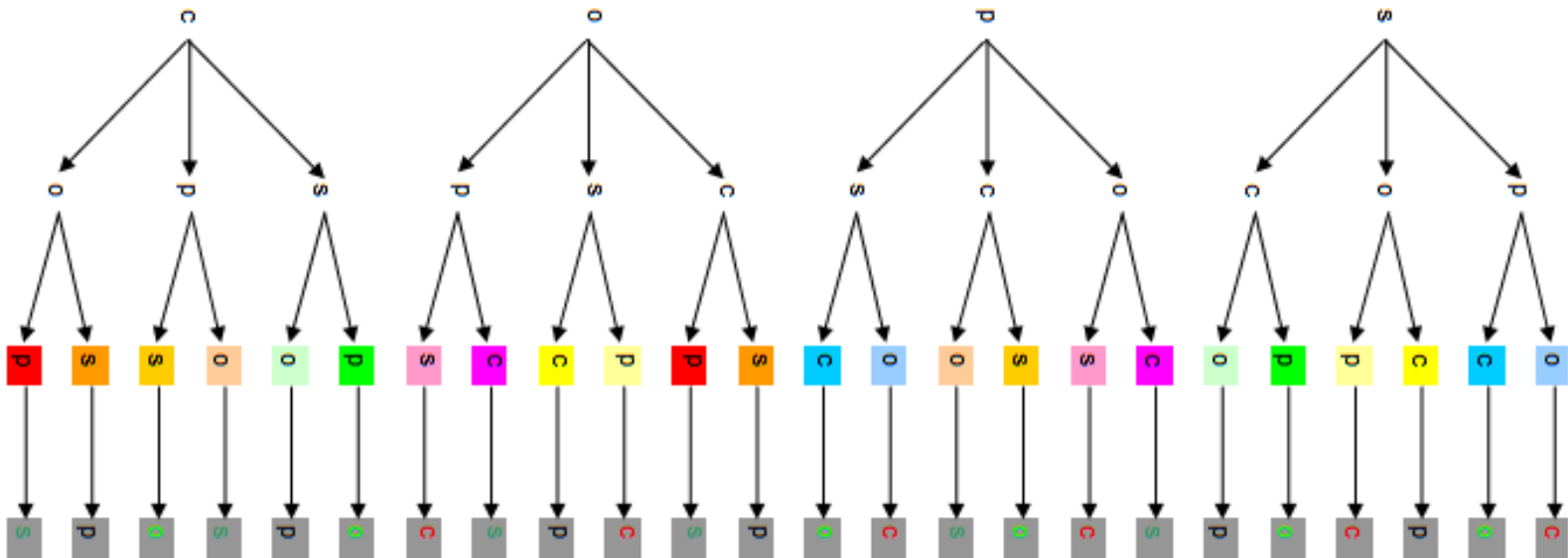
# Vector Model

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## HexaStore & the Vector Model



In our work we elaborate on the vector representation of triples proposed for the [Hexastore](#), by expanding it onto quadruple representation





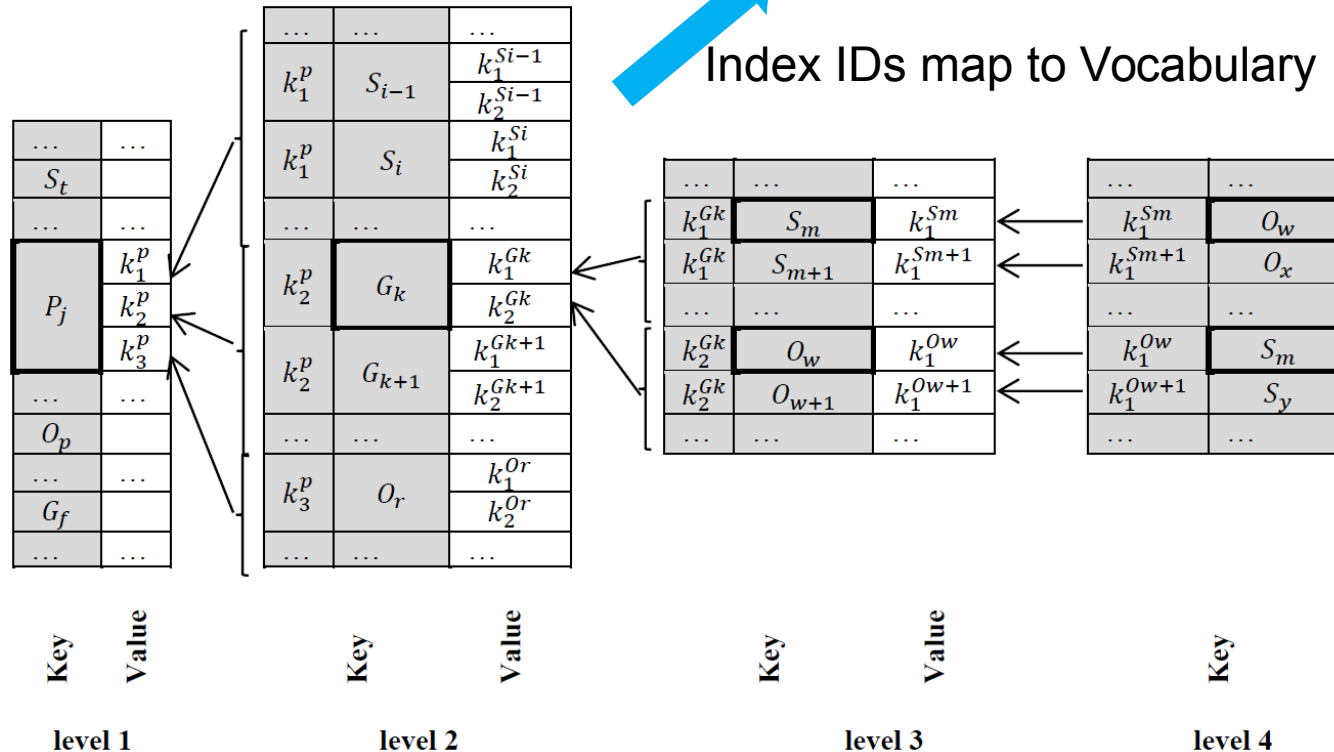
# Data Storage Components

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## Database Structure:

- Key-value indexes (Index-24)
- Vocabulary

ID	Type	Value
$S_t$	IRI	$\langle \text{http://purl.org/dc/...} \rangle$
...		
$P_j$	IRI	$\langle \text{http://example.org/...} \rangle$
...		
$O_p$	xsd:dateTime	"2005-02-28T00:00:00Z"
...		
$G_f$	IRI	$\langle \text{http://mygraph.com} \rangle$





## Persistence Strategy

- The DBMS creates several files for storing data. The file combines both a structure for storing data and an **Key-Value index** implemented as B-trees (or B\*-trees) because it ensures the support of prefix range lookups.
- The DBMS keeps all unique values in a separate **Vocabulary**, and **Key-Value indexes** contain references (fixed-length identifiers) to the **Vocabulary** items.
- Vocabulary** is a full lexicon of URI's and literals that are “known” to the base which associates the values of S, P, O and G with their vocabulary ID's that are unique within a DB instance.

**Index-type** configuration parameter can take four values:

- polymorphic2** provides two indexes configuration. Supports PSO, POS indexes.
- polymorphic6 | polymorphic6monolith** provides six indexes configuration. Supports PSOG, PSGO, POSG, POGS, PGOS, PGSO indexes.
- polymorphic24** provides twenty four indexes configuration. Supports all permutations (24) of four elements SPOG.



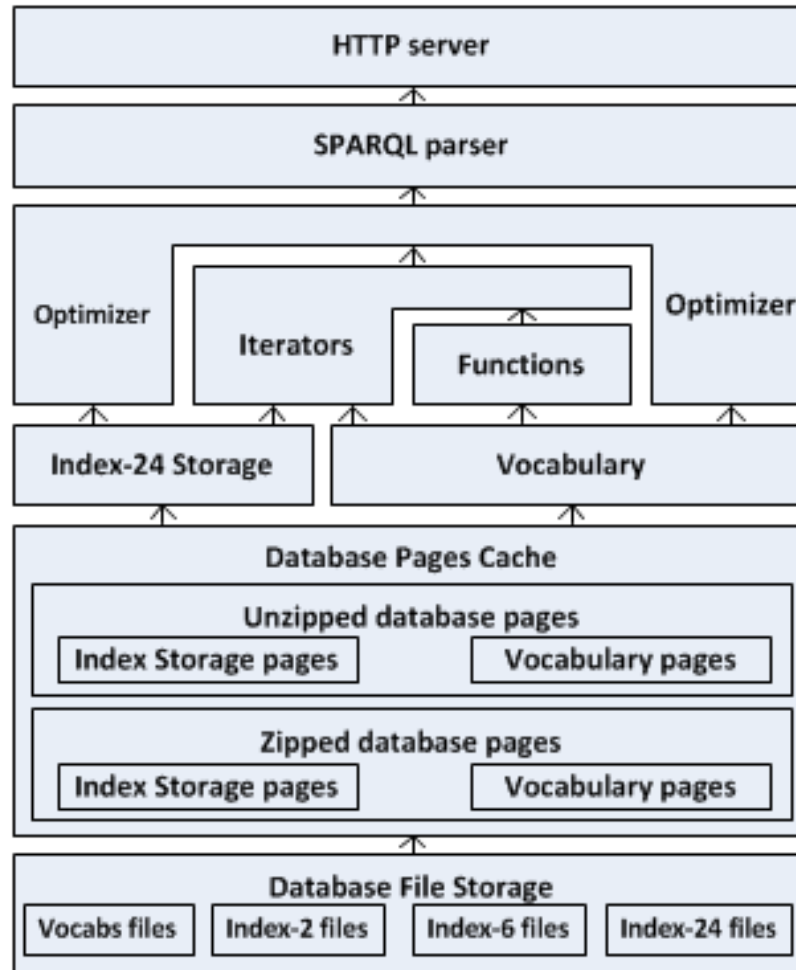
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# Components Architecture





# Component Scheme



Brief components description is on next page



- The built-in **HTTP Server** is a SPARQL 1.1 endpoint;
- The **SPARQL Parser** does syntactic analysis of queries and generates of the initial QEP tree;
- The **Optimizer** transforms the initial QEP into a new equivalent QEP with more optimal performance time and resources;
- The **Iterators** implement SPARQL algebra operators of QEP;
- The **Functions** are either functions of the SPARQL language or custom functions;
- The **Vocabulary** is a comprehensive lexicon of URI's and literals downloaded into the database;
- The **Index-24** implements different PSOG indexes;
- The **Database Page Cache** (zipped and unzipped) keeps last used Index-24 and **Vocabulary** pages from the **Database File Storage**;
- The **Database File Storage** stores the Index-24 and the Vocabulary in the B-tree (B\*-tree).



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# Iterators Algorithms



In OntoQuad the **Iterators** are the main building blocks of **Query Execution Plan**

All of the SPARQL algebra operators are implemented by means of the **Iterators**

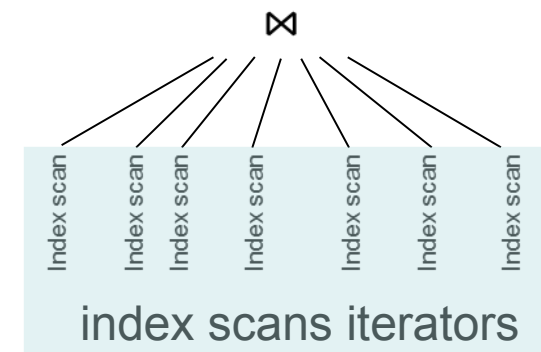
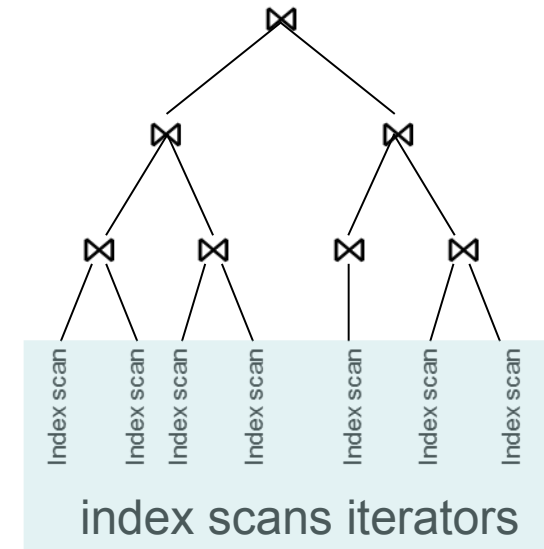
### Join Iterator Family: $\bowtie (L, R)$

- $\bowtie$  (sorted; sorted),
- $\bowtie$  (unsorted; sorted),
- $\bowtie$  (unsorted; unsorted).

### Multiple Join Iterator Family $\bowtie_M(R_1, R_2, \dots, R_n)$

- $\bowtie_M$ (sorted, sorted, ..., sorted) and
- $\bowtie_M$ (unsorted, sorted, ..., sorted).

All of JOIN iterators for scanning the datasets use the **lowerBound(key<sub>begin</sub>)** method which sets the **begin** pointer to the start of the range **[key<sub>begin</sub>, MAX\_KEY\_VAL)**





# ZIG-ZAG Join Algorithm for Join Iterator

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$L$  is sorted by  $P$ ,  $R$  is sorted by  $PG$

$\begin{Bmatrix} ?s & :p_1 & ?o_1 & ?g & . \\ ?s & :p_2 & ?o_2 & :g_2 & . \end{Bmatrix} \rightarrow \begin{Bmatrix} :p_1 & ?s & ?o_1 & ?g & . \\ :p_2 & :g_2 & ?s & ?o_2 & . \end{Bmatrix}$

$L \leftarrow \text{PSOG}$   
 $R \leftarrow \text{PGSO}$

PSGO  
 POSG  
 POGS  
 PGOS

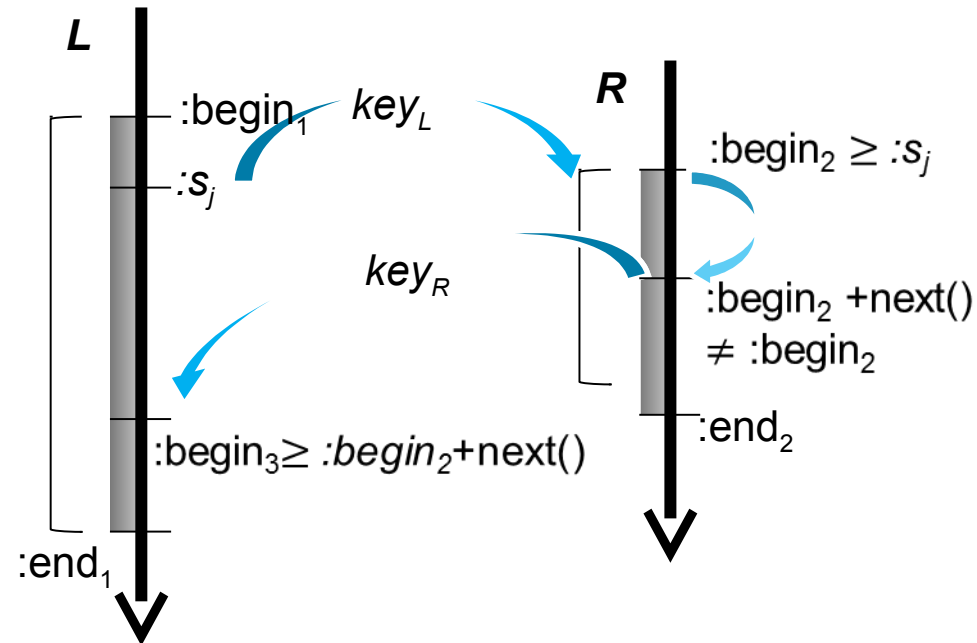
$\bowtie (L_{\text{sorted}}, R_{\text{sorted}})$

$\text{indexScan}_L(\text{PSOG}, \text{key}_L)$      $\text{indexScan}_R(\text{PGSO}, \text{key}_R)$

L=	S	O	G	R=	S	O
	5	o1	g1		1	o432
	7	o1	g2		16	o8
	...	...	...		17	o432
	10	o12	g1		...	...
	20	o129	g2		19	o129
	50	o5	g7		20	o8
	...	...	...		20	o31
	55	o8	g126		60	o55
	60	o432	g15		61	o70
	60	o433	g9		...	...
	81	o8	g43		67	o11
	90	o231	g65			
150	o31	g98				
						Stop

Join result

20	o129	g2	+	20	o8
20	o129	g2	+	20	o31
60	o432	g15	+	60	o55
60	o433	g9	+	60	o55

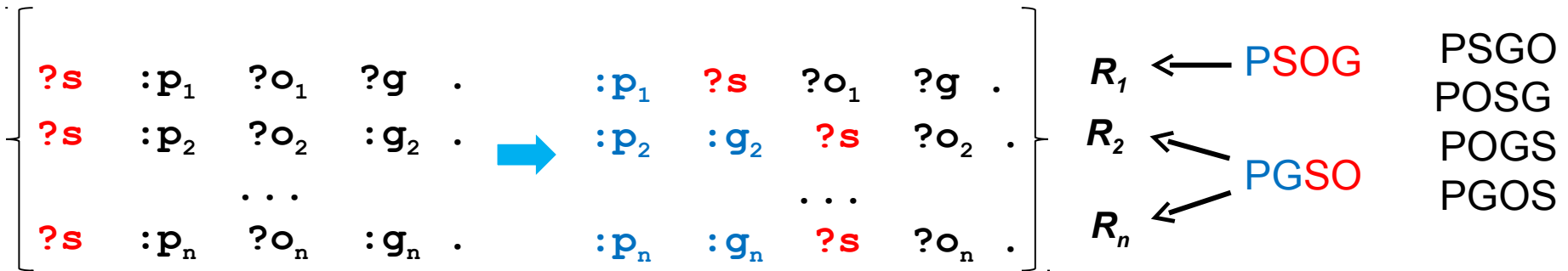


ordered sets of the  $L$  and  $R$  keys

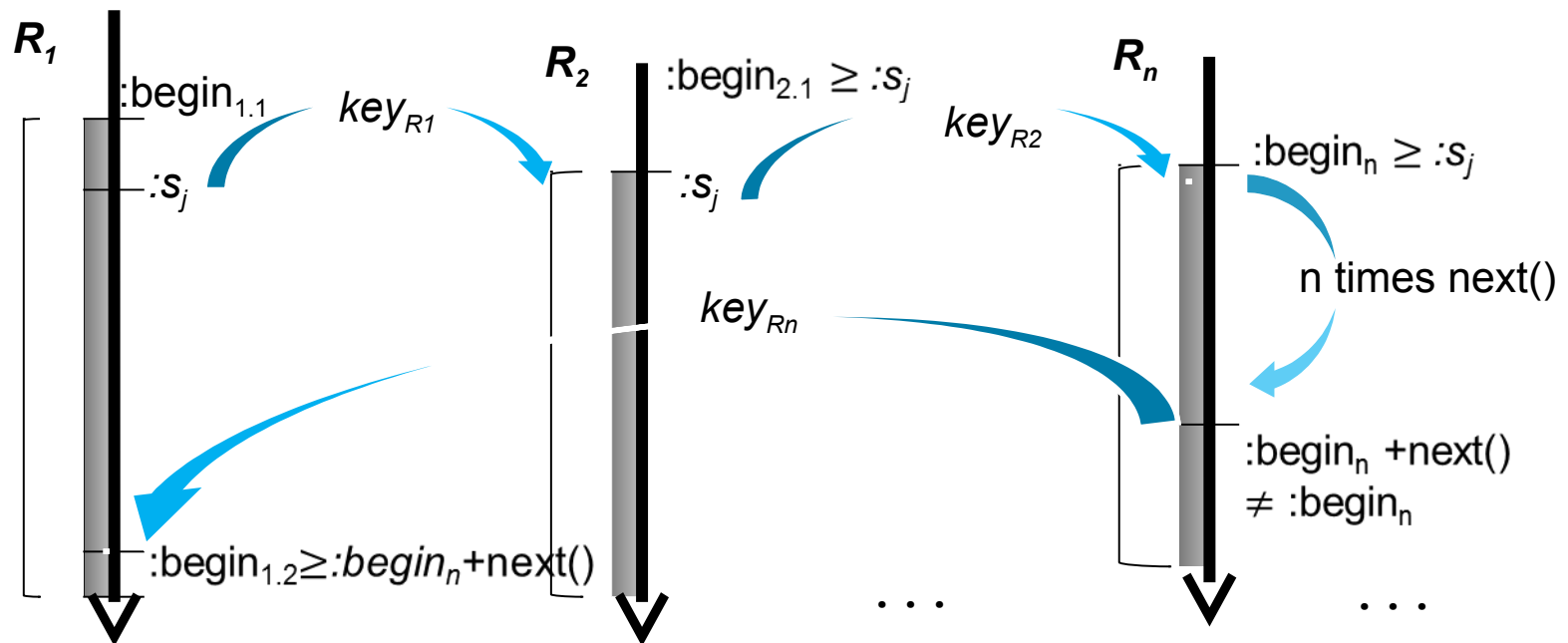


# ZIG-ZAG Join Algorithm for Multiple Join Iterator

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**lowerBound(key<sub>begin</sub>)** method of JOIN iterator sets **begin** pointer to the beginning of the range **[key<sub>begin</sub>, EOF)**



ordered sets of the  $R_1, R_2, \dots$  and  $R_n$  keys



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# Execution Plan Optimization Based on Heuristics



## Heuristics List Overview:

- Leaf iterator constants shift
- Transform Cartesian product to join
- Reorder joins
- Sort Minus arguments
- Sort outer join arguments
- Remove unrequired reordering
- Execute the simplest union first
- Move Projection closer to leafs
- Move filters closer to leafs
- Merge Distinct with Sorting
- Set sorted set limit
- Chose optimal distinct algorithm
- Merge join with filter
- Replace join with multiple join
- Convert nested multiple joins to one multiple join
- and something e/se ...

Static Query **Heuristics-based Optimizer** transforms an initial Query Execution Plan  $D_0$  into an equivalent plan  $D_1$ .

It bases on heuristic transformations of QEP.







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## “How it Works” Example

# “How it Works” Example

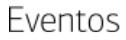




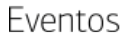
## Example. Query #5 BSBM

```
PREFIX rdfs: <http://www.w3.org/2000/01/rdf-schema#>
PREFIX rdf: <http://www.w3.org/1999/02/22-rdf-syntax-ns#>
PREFIX bsbm: <http://www4.wiwiss.fu-berlin.de/bizer/bsbm/v01/vocabulary/>

SELECT DISTINCT ?product ?productLabel
WHERE {
    ?product rdfs:label ?productLabel .
    FILTER (<http://www4.wiwiss.fu-berlin.de/bizer/bsbm/v01/instances/dataFromProducer3475/Product175673>
        != ?product)
    <http://www4.wiwiss.fu-berlin.de/bizer/bsbm/v01/instances/dataFromProducer3475/Product175673>
        bsbm:productFeature ?prodFeature .
    ?product bsbm:productFeature ?prodFeature .
    <http://www4.wiwiss.fu-berlin.de/bizer/bsbm/v01/instances/dataFromProducer3475/Product175673>
        bsbm:productPropertyNumeric1 ?origProperty1 .
    ?product bsbm:productPropertyNumeric1 ?simProperty1 .
    FILTER (?simProperty1 < (?origProperty1 + 120) && ?simProperty1 > (?origProperty1 - 120))
    <http://www4.wiwiss.fu-berlin.de/bizer/bsbm/v01/instances/dataFromProducer3475/Product175673>
        bsbm:productPropertyNumeric2 ?origProperty2 .
    ?product bsbm:productPropertyNumeric2 ?simProperty2 .
    FILTER (?simProperty2 < (?origProperty2 + 170) && ?simProperty2 > (?origProperty2 - 170))
}
ORDER BY ?productLabel LIMIT 5
```



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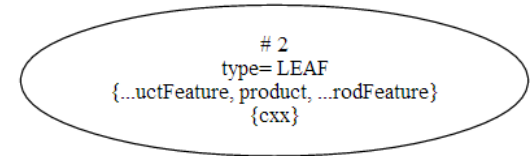
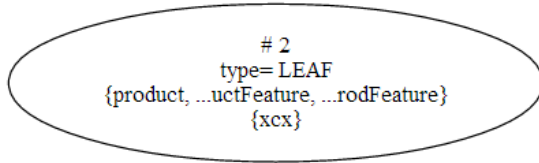




# “Leaf Iterator Constants Shift” Heuristic

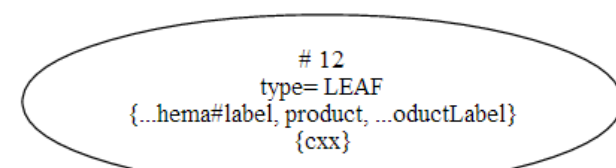
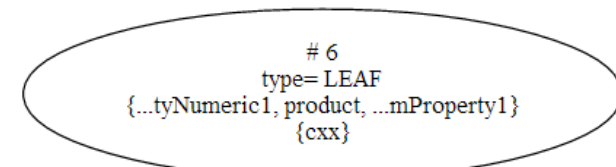
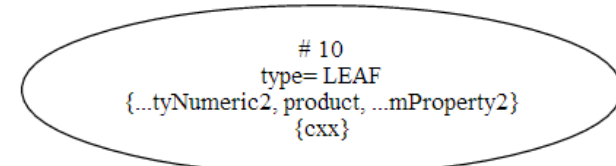
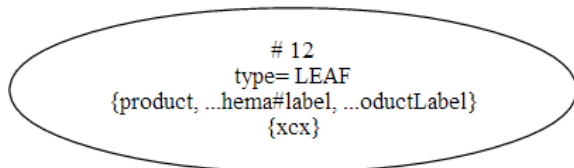
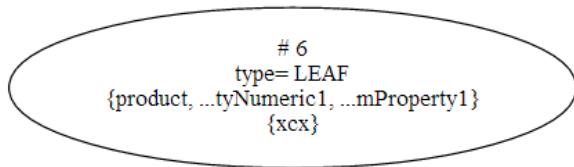
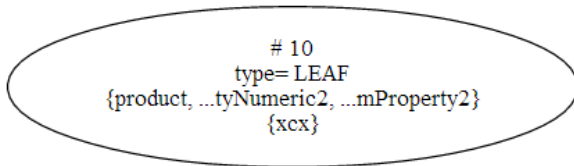
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?product **bsbm:productFeature** ?prodFeature .



**bsbm:productFeature** ?product ?prodFeature .

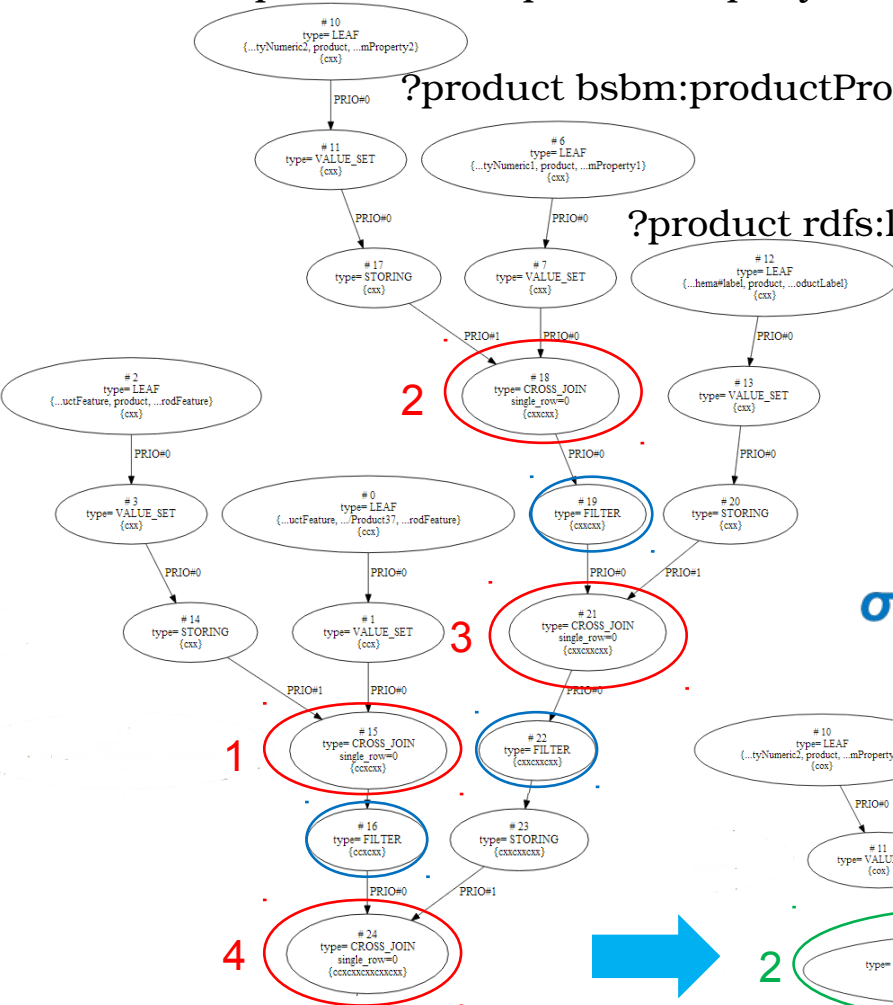
“Leaf iterator constants shift” move constants to the beginning





# “Transform Cartesian Product to Join” Heuristic

Eventos ?product bsbm:productPropertyNumeric2 ?simProperty2 .

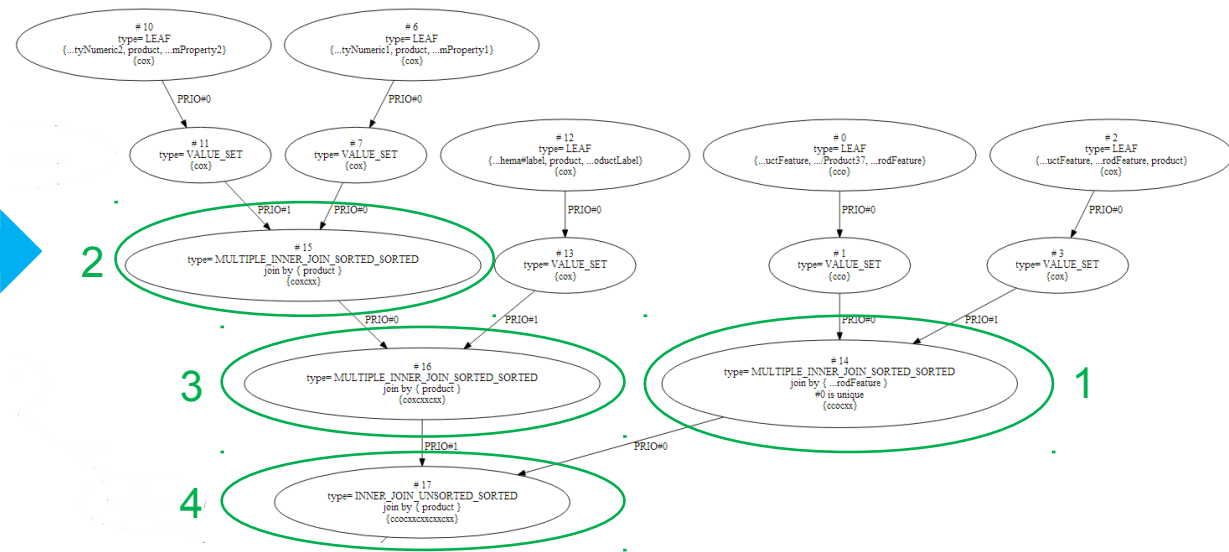


?product bsbm:productPropertyNumeric1 ?simProperty1 .

?product rdfs:label ?productLabel .

Turn the **Cross-product** iterator ( $\times$ ) into an iterator from the **Join family** ( $\bowtie$ ) enabling the use of indexScan(key) (e.g., zig-zag join).

$$\sigma_F(\times(L_1, R_2)) \Rightarrow \bowtie(L_1 \text{ sort\_order1}, R_2 \text{ sort\_order2})$$



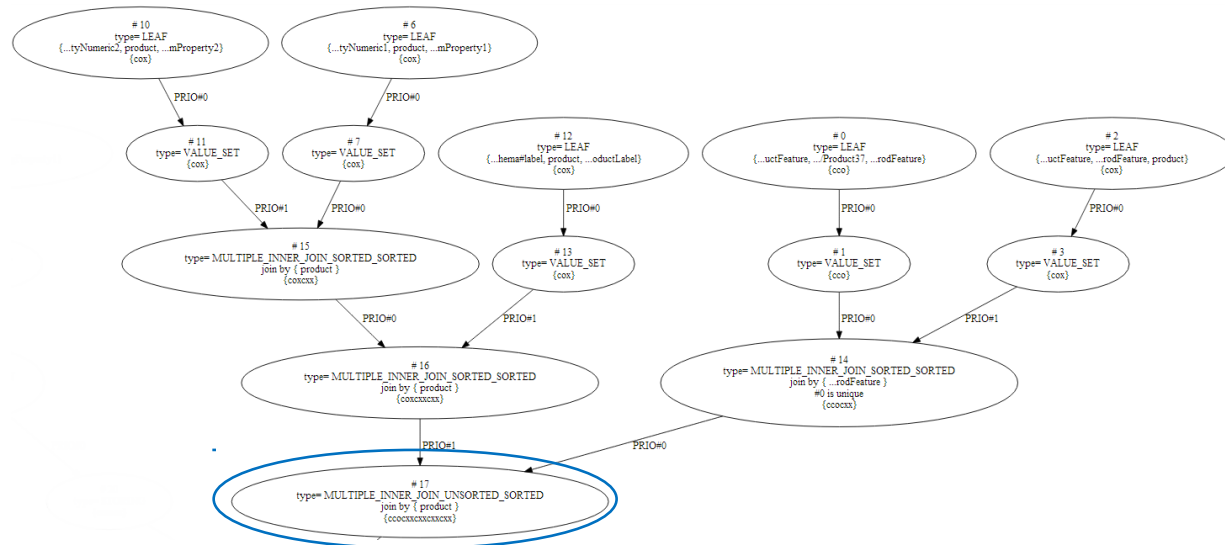


# “Replace Join with Multiple Join” Heuristic

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The **multiple join** operator can be used instead of the **join** operator even in case of just two input arguments because of it is faster in our implementation.

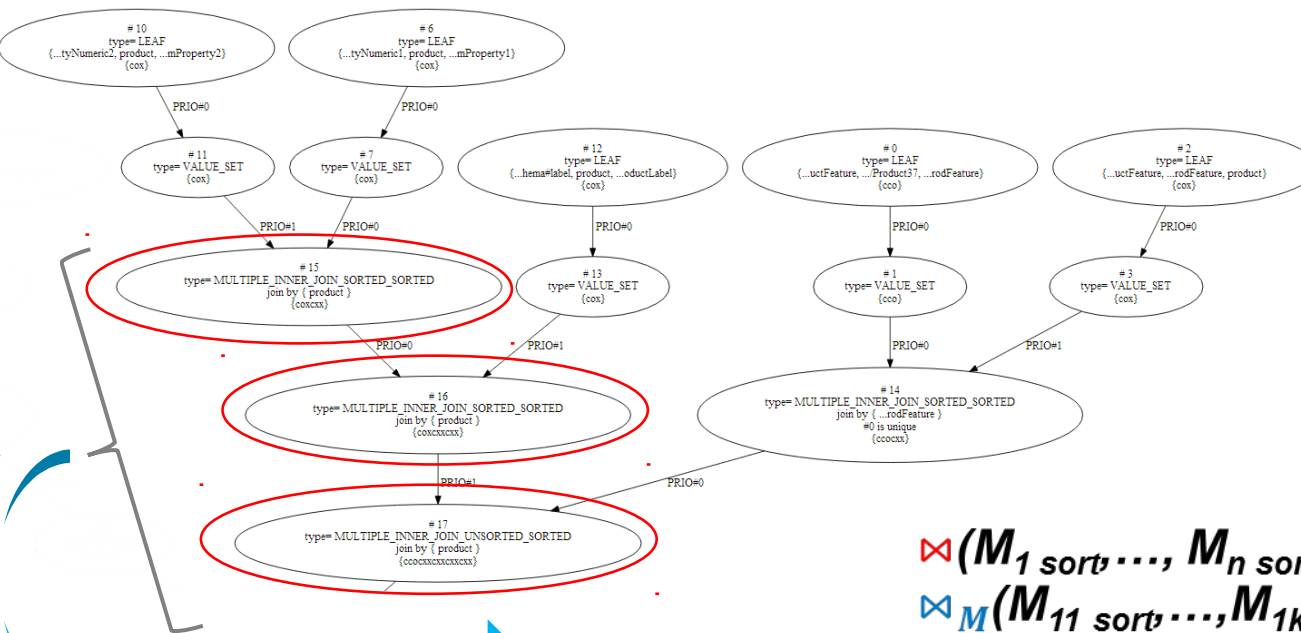
$$\bowtie (L_{\text{unsort}}, R_{\text{sort}}) \Rightarrow \bowtie_M (L_{\text{unsort}}, R_{\text{sort}})$$





# “Convert Nested Multiple Joins to One Multiple Join” Heuristic

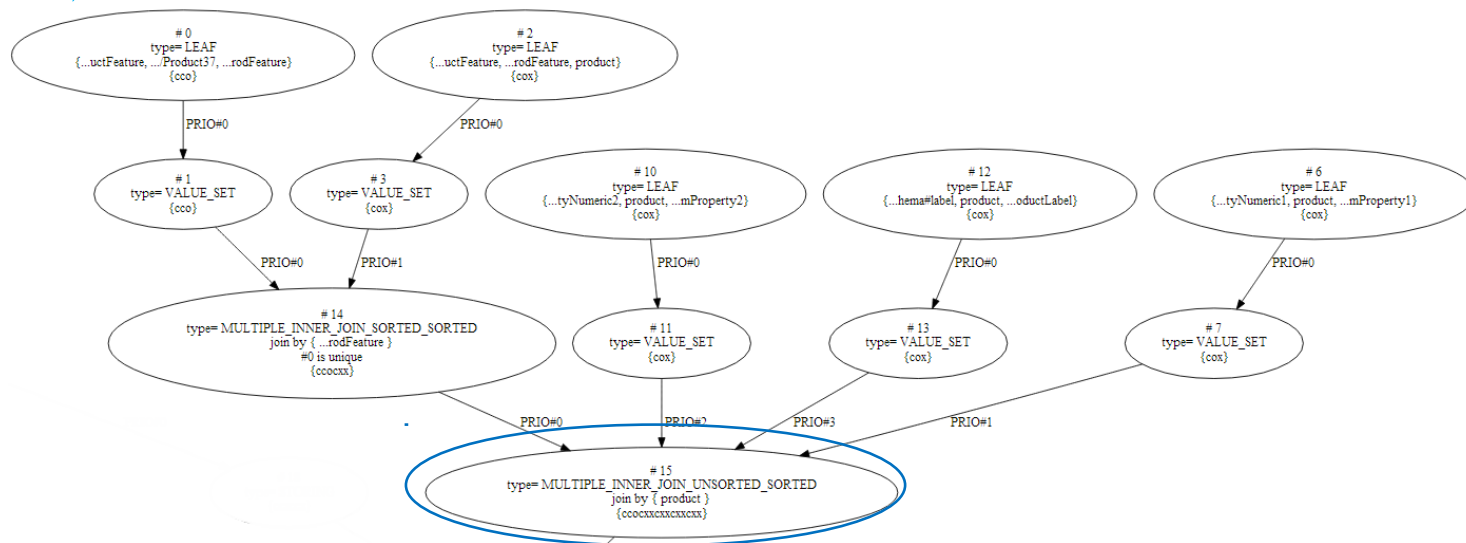
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The transformation converts several **nested multiple join** operators with identically sorted join variables into a **single multiple join** operator

$$\bowtie (M_1 \text{ sort}, \dots, M_n \text{ sort}) \Rightarrow \bowtie M(M_{11} \text{ sort}, \dots, M_{1k} \text{ sort}, \dots, M_{n1} \text{ sort}, \dots, M_{nm} \text{ sort})$$

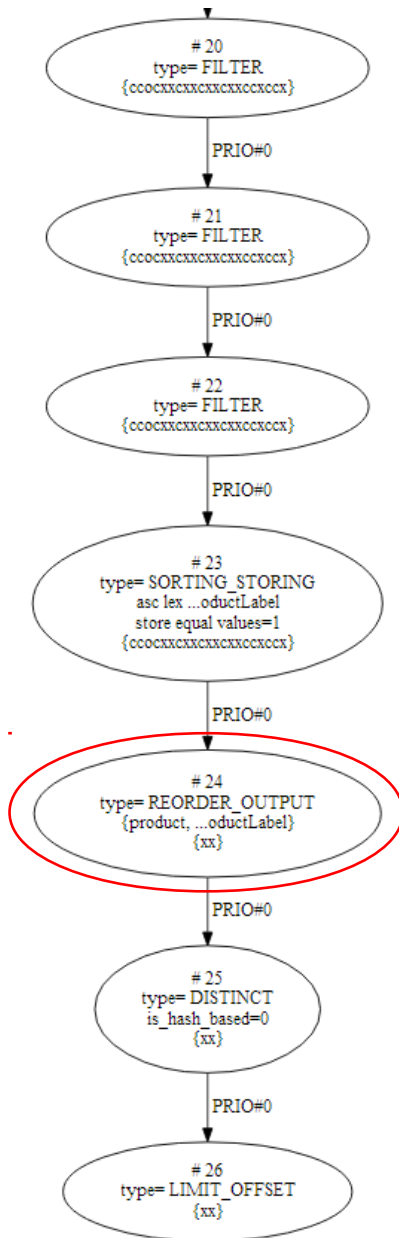
Nested Multiple Joins





# “Move Reordering Closer to the Leafs” Heuristic

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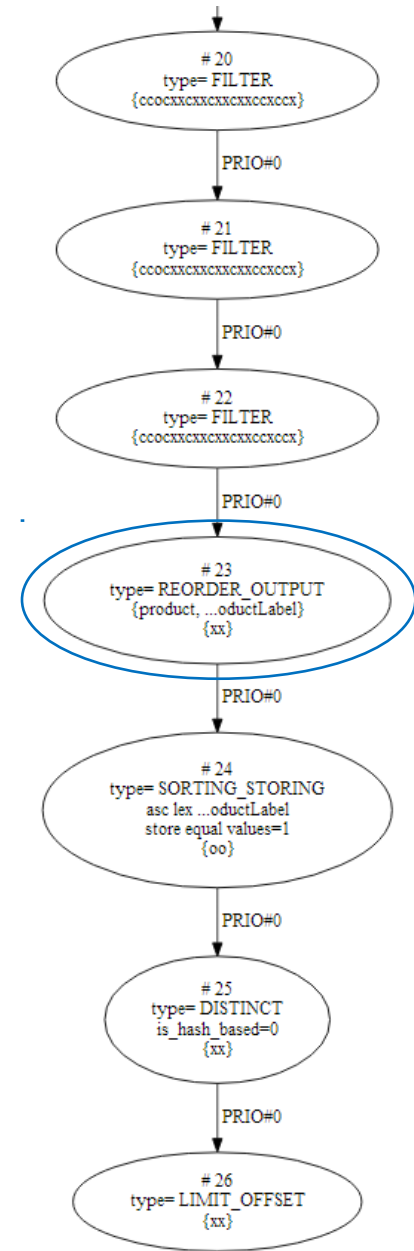
$$\tau_L(op_k(\Omega)) \Rightarrow op_k(\tau_L(\Omega))$$

Here  $\tau_L$  is the **Order by** operator



ORDER BY ?productLabel

We also use a similar heuristic  
“Move Projection closer to leafs”

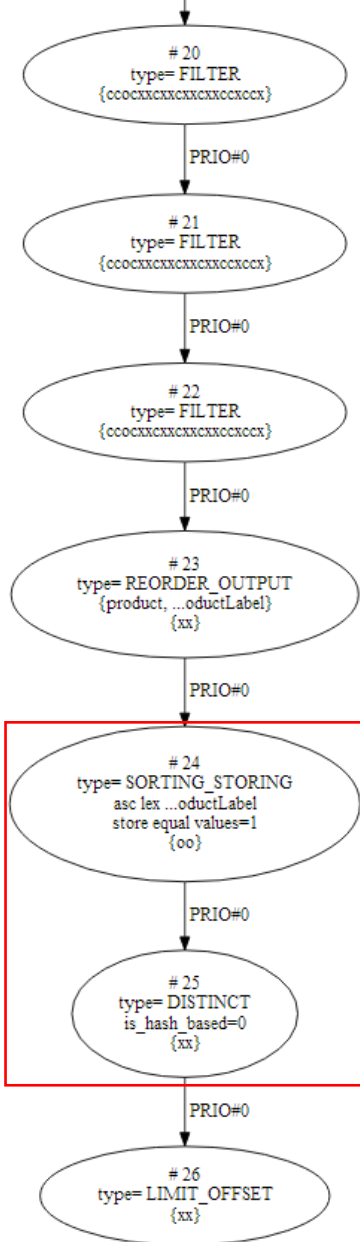






# “Merge Distinct with Sorting” Heuristic

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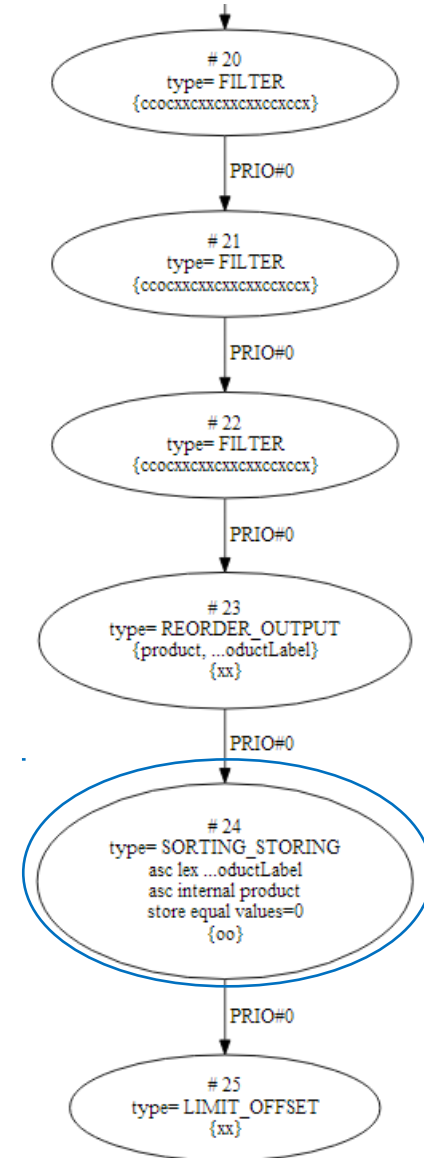


$$\tau_L(\delta(\Omega)) \Rightarrow \delta\tau_L(\Omega).$$

If a **Select** clause contains the **Distinct** and **Order by** solution modifiers, we replace them by a new iterator performing simultaneously the duplicate tuple removal and sorting functions



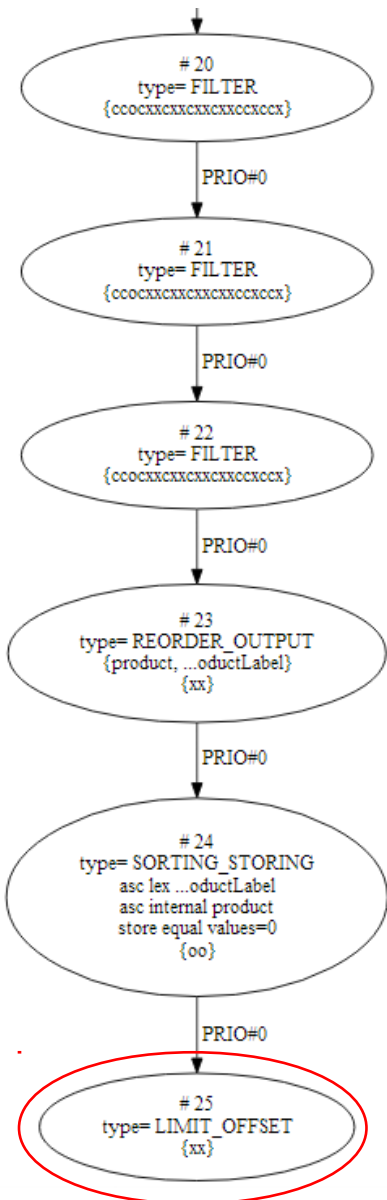
SELECT **DISTINCT** ?product ?productLabel  
WHERE {  
...  
} **ORDER BY** ?productLabel LIMIT 5





# “Set Sorted Set Limit” Heuristic

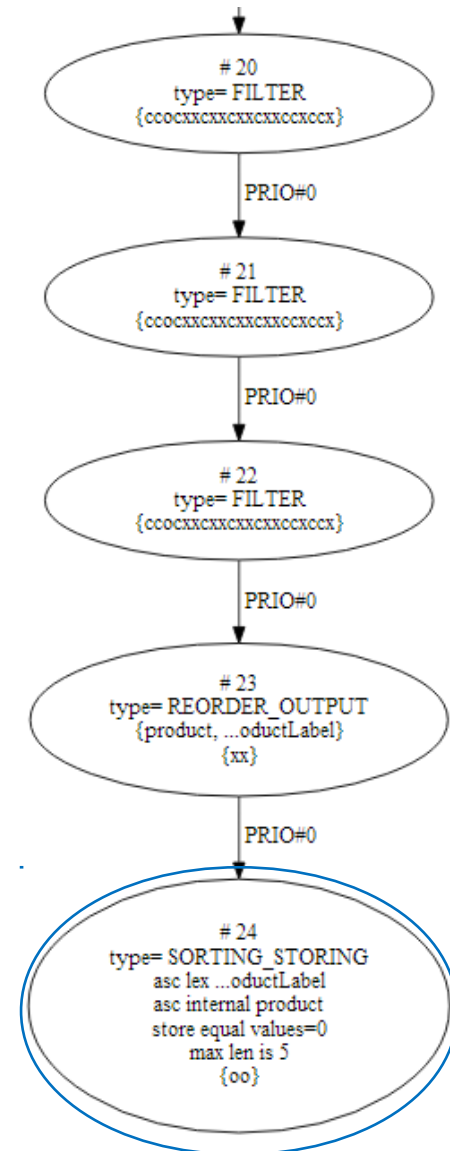
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If a **Select** clause contains the **Order by** and **Limit** solution modifiers, then we create a sorted set with a size specified in the **Limit** for storing resulting tuples



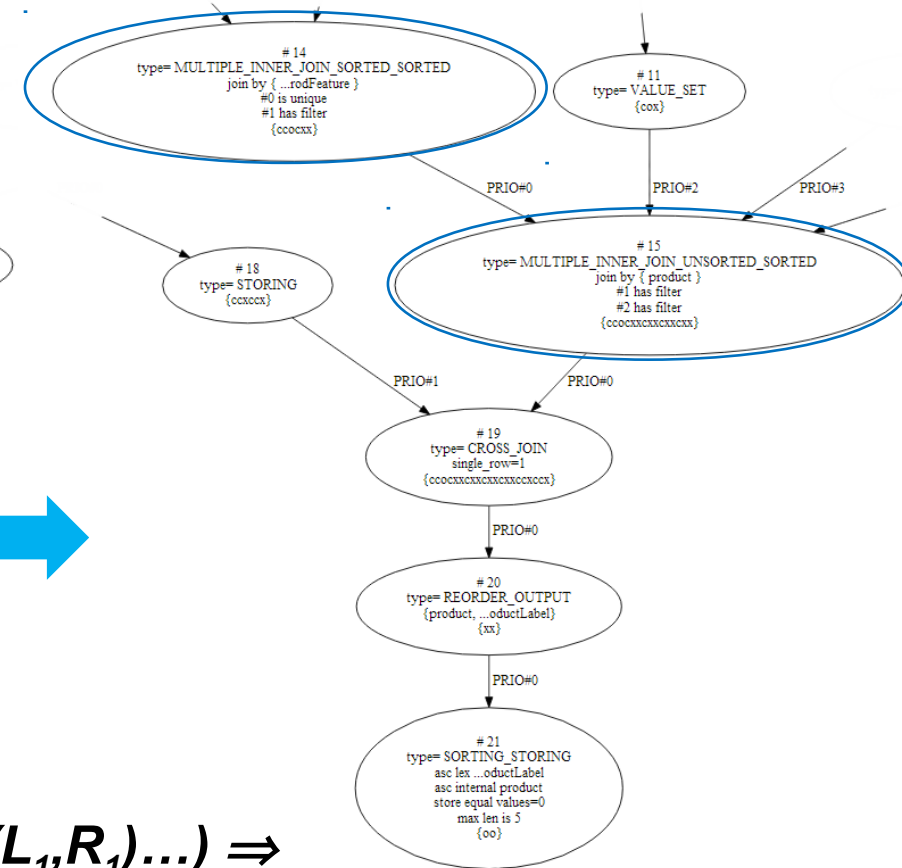
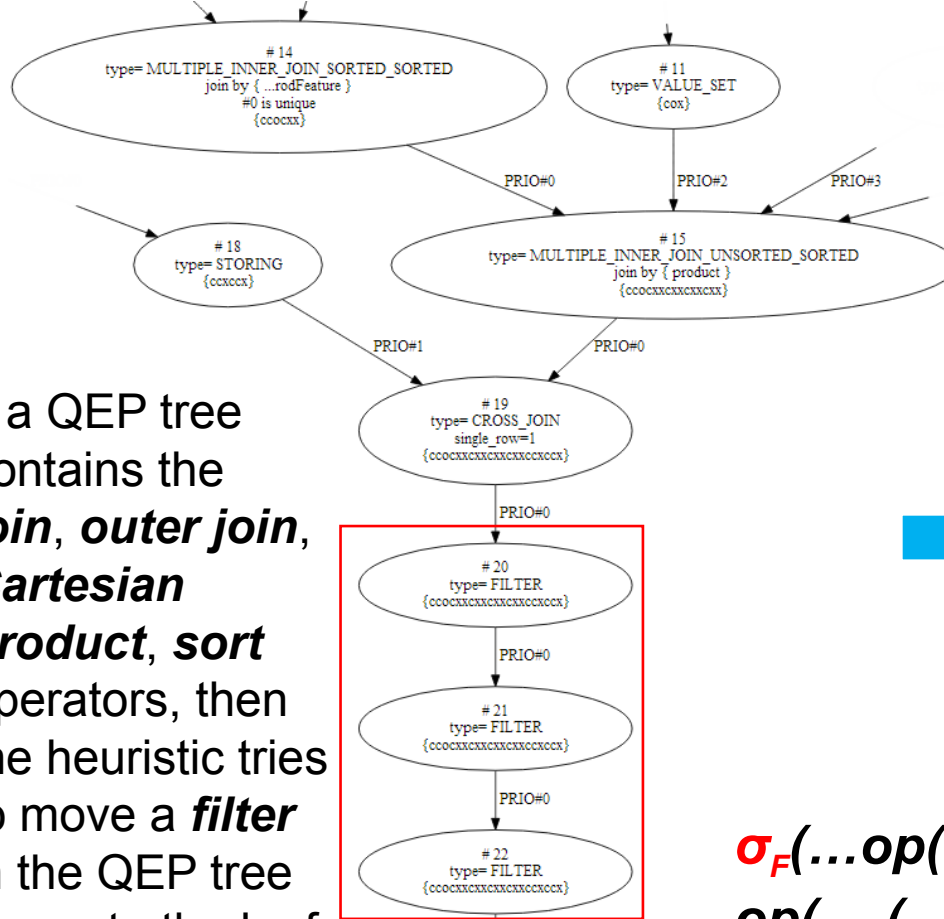
SELECT DISTINCT ?product ?productLabel  
WHERE {  
...  
} ORDER BY ?productLabel **LIMIT 5**





# "Move Filters Closer to Leafs" Heuristic

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$$\sigma_F(...op(L_1,R_1)...) \Rightarrow op(... (... \sigma_{F_1}(\Omega 1) ... \sigma_{F_2}(\Omega 2) ...) ...)$$

WHERE {

**FILTER** (<http://.../Product175673> != ?product)

...

**FILTER** (?simProperty1 < (?origProperty1 + 120) && ?simProperty1 > (?origProperty1 - 120))

...

**FILTER** (?simProperty2 < (?origProperty2 + 170) && ?simProperty2 > (?origProperty2 - 170))

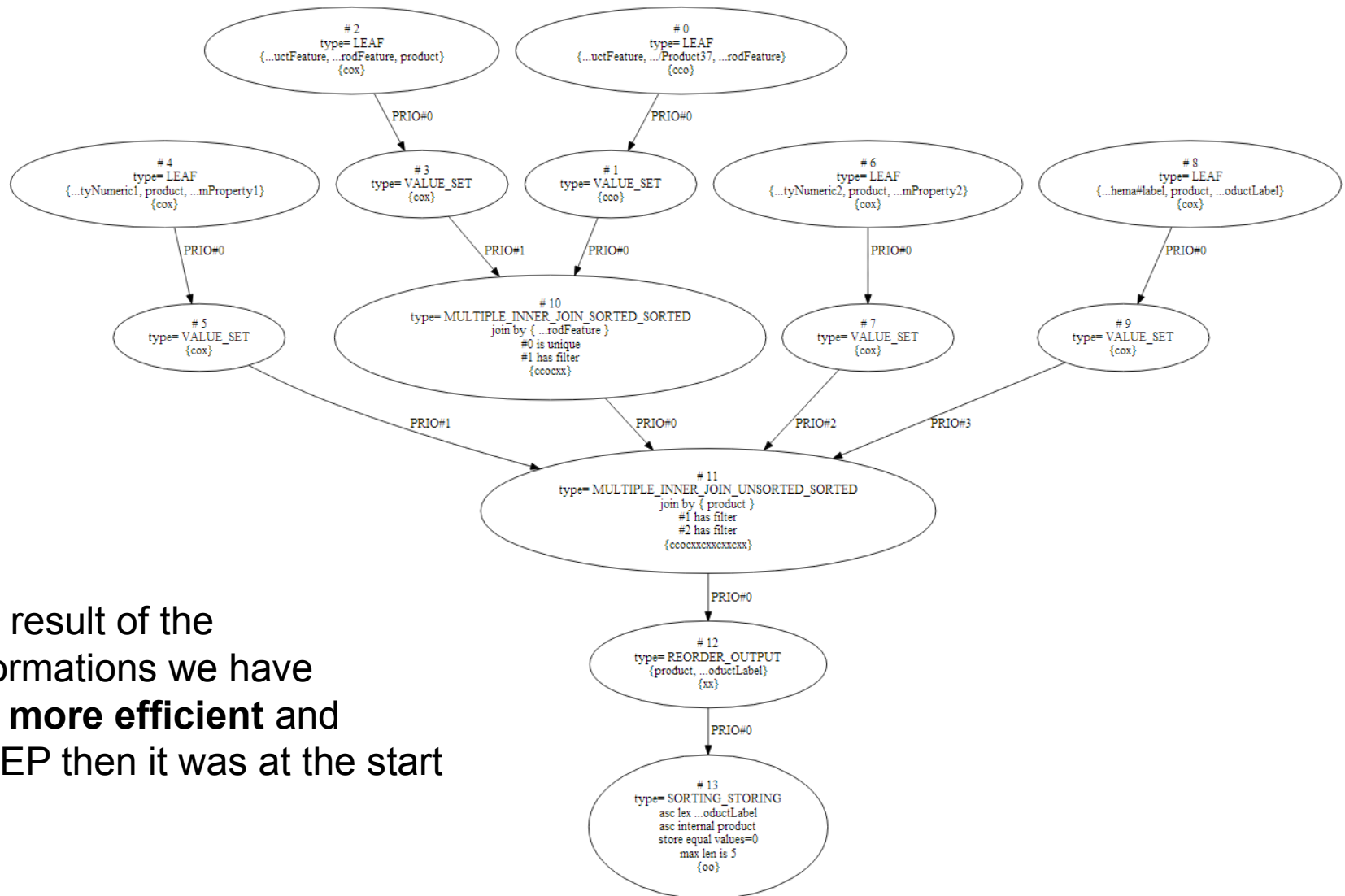
} ORDER BY ?productLabel LIMIT 5

If a QEP tree contains the **join, outer join, Cartesian product, sort** operators, then the heuristic tries to move a **filter** in the QEP tree closer to the leaf nodes, placing it before these operators



# Resulting QEP

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As the result of the transformations we have **short, more efficient and fast** QEP then it was at the start



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# BSBM Evaluation



**The 1-st stage was run in June 2013** in Universität Leipzig, Institut für Informatik, Germany

## **Benchmark machine**

- quad-core Intel i7-3770 CPU with 32 GB of RAM.
- storage is 2x2 TB 7200rpm SATA hard drives, configured as software RAID 1.

## **Benchmark**

Berlin SPARQL Benchmark (BSBM) Specification - V3.1, Explore Use Case

The **database size** varied from **10 million** triples, **100 million** triples and **1 billion** triples, runs done for **1, 4, 8, 16** parallel clients.

All systems were configured to use 22GB of main memory.

## **Three RDF DBMS were compared to OntoQuad**

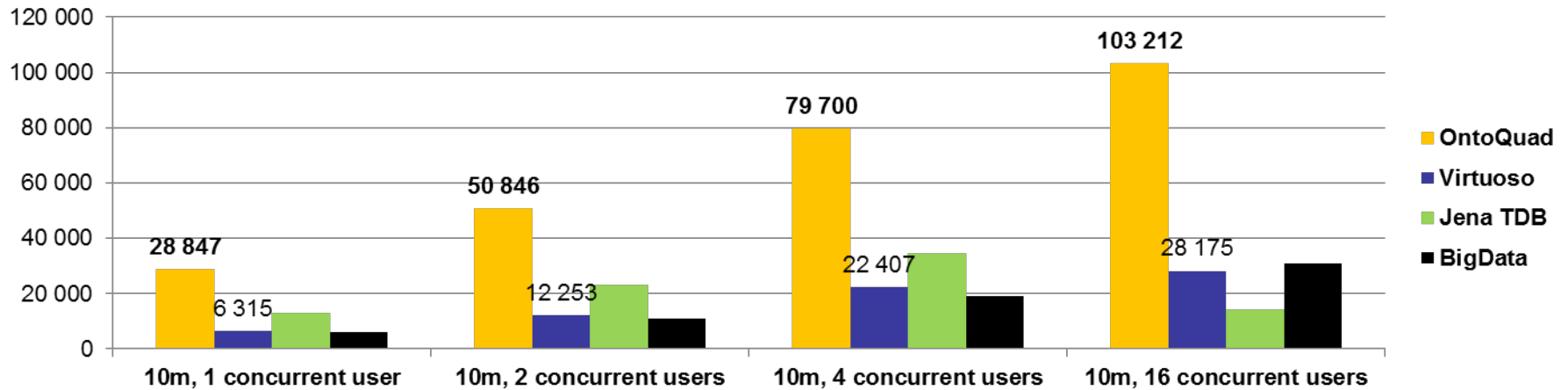
- Virtuoso 6.1.6**,
- Jena TDB** (Fuseki 0.2.7) and
- BigData** (Release 1.2.2).



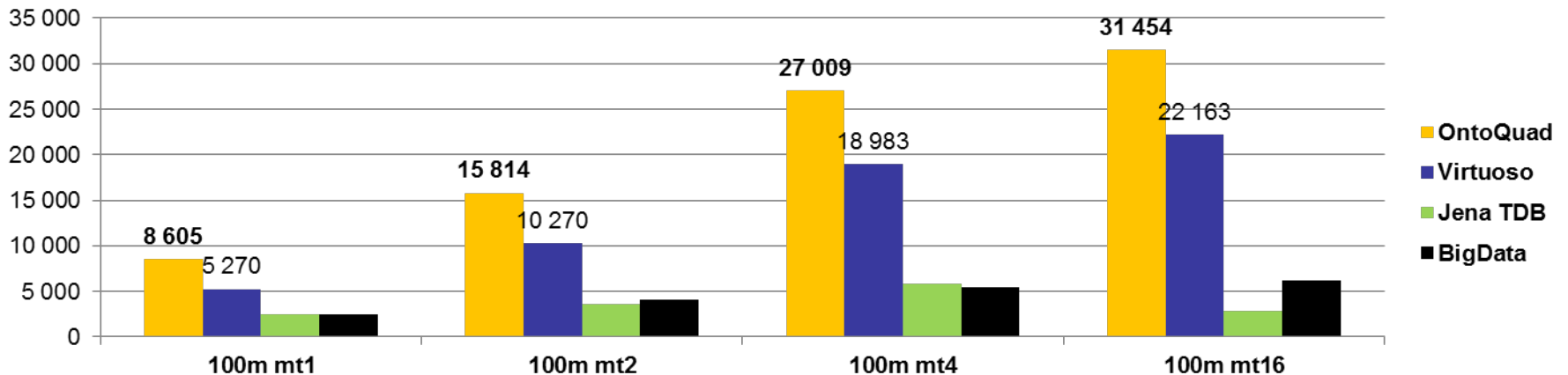
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# 1-st stage of the Benchmarking: BSBM Explore Use Case QMpH for 10 and 100 Millions of Triples

## Query Mix per Hour for 10 millions of the triples dataset



## Query Mix per Hour for 100 millions of the triples dataset





**The 2-nd stage was run in August - September 2013** in National Research University - Higher School of Economics, Semantic Technology Centre, Moscow, Russia. The only RDF DBMS compared to the latest version of OntoQuad is **Open source Virtuoso branch stable/7** – the leader of the BSBM tests

### Benchmark machine

- VMware Virtual Platform installed on the machine with 8 processors Intel(R) Xeon(R) (16 hyper threading core) CPU X5550@2.67GHz,
- SCSI storage controller: LSI Logic / Symbios Logic 53c1030 PCI-X Fusion-MPT Dual Ultra320 SCSI, HDD 969 GB.
- 29 GB RAM, 15 GB of swap area

### Benchmark

Berlin SPARQL Benchmark (BSBM) Specification - V3.1, Explore Use Case. The database size varied from **100 million**, **200 million** and **500 million** triples, runs done for **1, 4, 8, 16, 32, 64** parallel clients.

We used a reduced set of the query mix. Query #9 (DESCRIBE) has been excluded.

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Both Virtuoso and OntoQuad were configured to use 24 GB of main memory

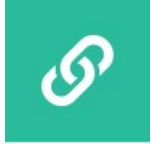
### **Virtuoso 7**

Was set up according to [RDF Performance Tuning](#) of the Virtuoso Open-Source Wiki.

MaxCheckpointRemap	= 200000
NumberOfBuffers	= 2040000
MaxDirtyBuffers	= 1500000
CheckpointInterval	= 600

### **OntoQuad**

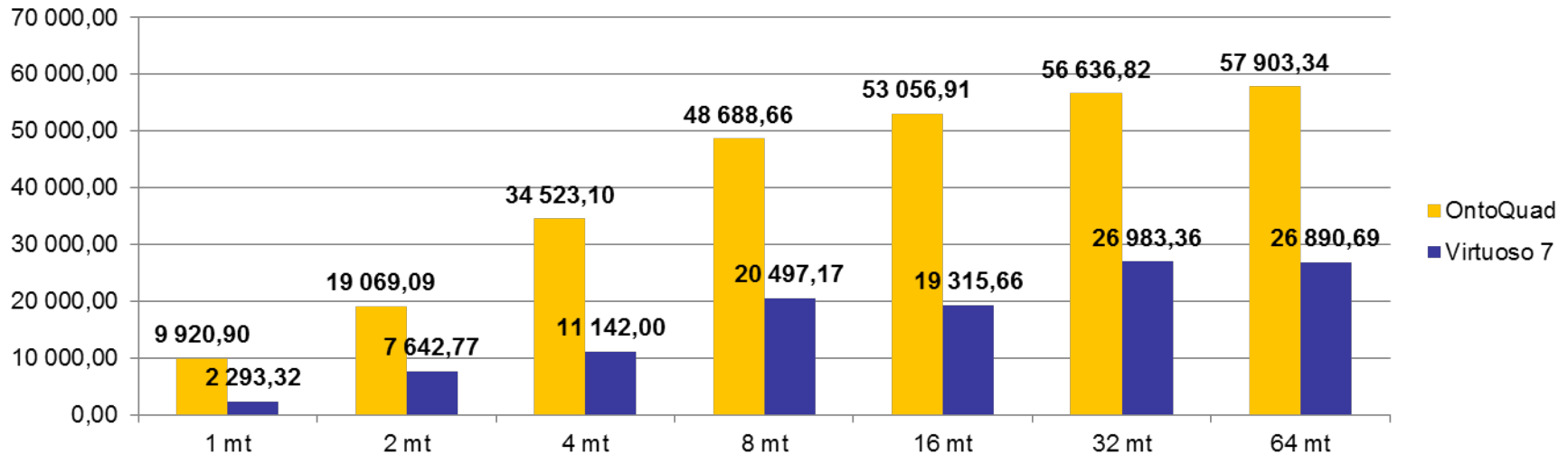
cacheSize = 11811160064  
compressed-page-cacheSize = 13958643712



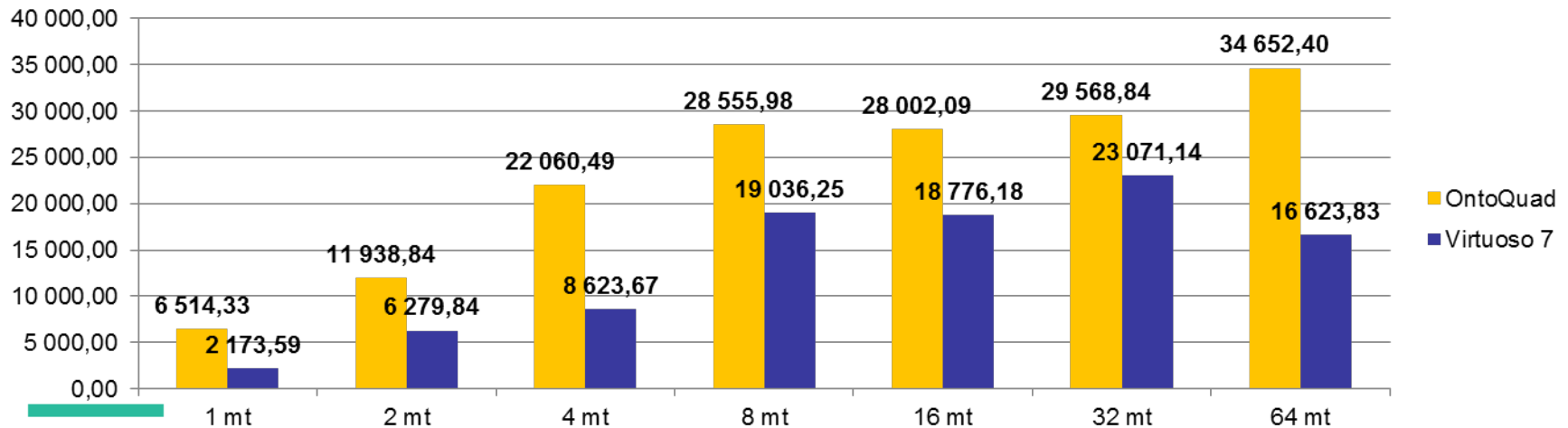
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## 2-st stage of the Benchmarking: BSBM Explore Use Case QMpH for 100 and 200 Millions of Triples

### Query Mix per Hour for 100 millions of the triples dataset



### Query Mix per Hour for 200 millions of the triples dataset

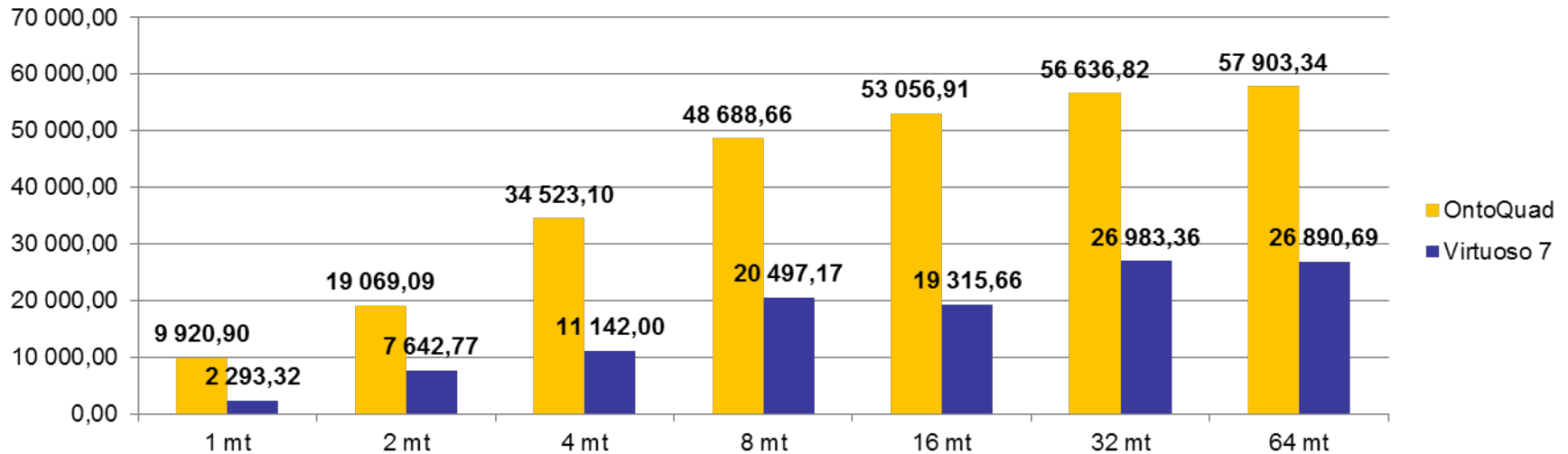




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## 2-st stage of the Benchmarking: BSBM Explore Use Case QMpH for 500 Millions of Triples

### Query Mix per Hour for 500 millions of the triples dataset



### Query Mix per Hour for 200 millions of the triples dataset