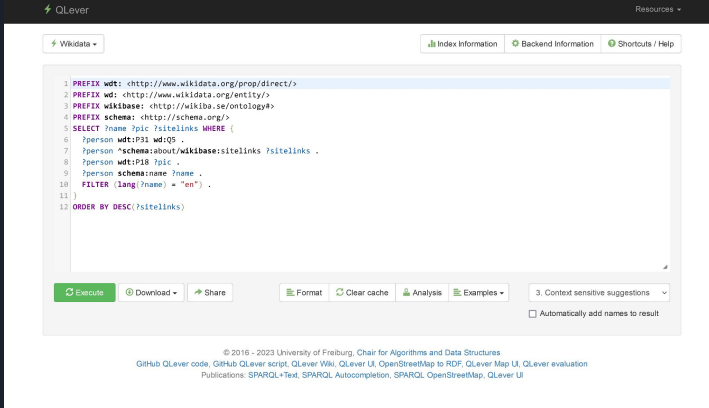


Lazy Evaluation of SPARQL Queries with Caching

Robin Textor-Falconi

QLever & SPARQL

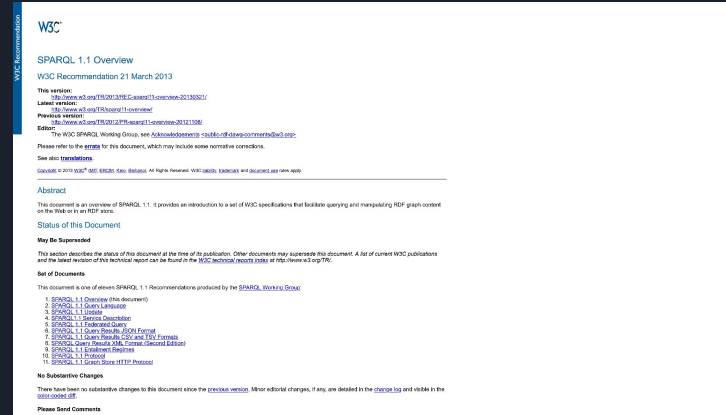


The screenshot shows the QLever web interface. At the top, there is a navigation bar with "Wikidata" selected, and links for "Index Information", "Backend Information", and "Shortcuts / Help". The main area contains a SPARQL query editor with the following code:

```
1 PREFIX wdt: <http://www.wikidata.org/prop/direct/>
2 PREFIX wd: <http://www.wikidata.org/entity/>
3 PREFIX wikibase: <http://wikiba.se/ontology#>
4 PREFIX schema: <http://schema.org/>
5 SELECT ?name ?pic ?sitelinks WHERE {
6   ?person wdt:P58 wd:Q5 .
7   ?person "schema:about/wikibase:sitelinks ?sitelinks .
8   ?person wdt:P58 ?pic .
9   ?person schema:name ?name .
10  FILTER (lang(?name) = "en") .
11 }
12 ORDER BY DESC(?sitelinks)
```

Below the editor are buttons for "Execute", "Download", "Share", "Format", "Clear cache", "Analysis", and "Examples". A dropdown menu shows "3. Context sensitive suggestions" and a checkbox for "Automatically add names to result". At the bottom, there is a copyright notice: "© 2016 - 2023 University of Freiburg, Chair for Algorithms and Data Structures. GitHub QLever code, GitHub QLever scripts, QLever Wiki, QLever UI, OpenStreetMap to RDF, QLever Map UI, QLever evaluation. Publications: SPARQL-Text, SPARQL Autocompletion, SPARQL OpenStreetMap, QLever UI".

<https://qlever.cs.uni-freiburg.de>



The screenshot shows the W3C Recommendation page for "SPARQL 1.1 Overview". The page header includes the W3C logo and the text "W3C Recommendation". The main content area has the following sections:

- SPARQL 1.1 Overview**
W3C Recommendation 21 March 2013
- This version**
130220e2-2013-REC-SPARQL1-overview-20130321/
- Local editors**
http://www.w3.org/2013/03/21/tracker/
- Previous versions**
http://www.w3.org/2013/03/21/tracker/1-overview-20131106/
- Editors**
The W3C SPARQL Working Group, see <http://lists.w3.org/Archives/Public/dao-wg-comments/201303/>.
- Please refer to the [intro](#) for this document, which may include some normative corrections.**
- See also [translations](#).**
- Copyright**
Copyright © 2013 W3C® MIT, ERCIM, Keio, Intellect, INRIA, Hewlett-Packard, NEC, NTT, Microsoft, Sony, and others. All Rights Reserved. W3C®, W3C® and W3C® are trademarks of W3C® and other members.
- Abstract**
This document is an overview of SPARQL 1.1. It provides an introduction to a set of W3C specifications that facilitate querying and manipulating RDF graph content on the Web or in an RDF store.
- Status of this Document**
- May Be Superseded**
This section describes the status of this document at the time of its publication. Other documents may supersede this document. A list of current W3C publications and the latest revision of this technical report can be found in the [W3C Technical Reports Index](#) at <http://www.w3.org/TR/>.
- Set of Documents**
This document is one of eleven SPARQL 1.1 Recommendations produced by the [SPARQL Working Group](#):
 1. SPARQL 1.1 Overview (this document)
 2. SPARQL 1.1 Query Language
 3. SPARQL 1.1 Update
 4. SPARQL 1.1 Protocol Description
 5. SPARQL 1.1 Query Semantics
 6. SPARQL 1.1 Query Results: JSON Format
 7. SPARQL 1.1 Query Results: CSV and TSV Formats
 8. SPARQL Query Results XML Format (Second Edition)
 9. SPARQL 1.1 Query Results: Streaming
 10. SPARQL 1.1 Update: Streaming
 11. SPARQL 1.1 Query Store HTTP Protocol
- No Substantive Changes**
There have been no substantive changes to this document since the [previous version](#). Minor editorial changes, if any, are detailed in the [change log](#) and visible in the [source code](#).
- Please Send Comments**

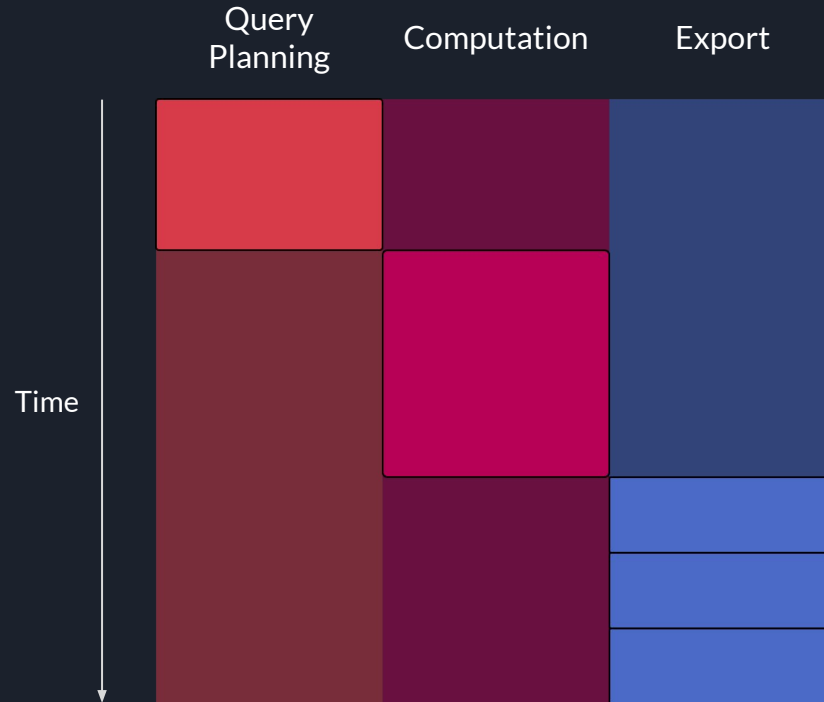
<https://www.w3.org/TR/2013/REC-sparql1-1-overview-20130321/>

Problem Definition





Current Processing Model





Practical Example

```
SELECT * WHERE { ?s ?p ?o }
```

INDEX SCAN ?s ?p ?o

Cols: ?o, ?p, ?s

Size: 20,052,950,074 x 3 [~ 20,052,968,255]

Time: 51,357ms [~ 20,052,968,255]



Practical Example

INDEX SCAN ?s ?p ?o

Cols: ?o, ?p, ?s

Size: 20,052,950,074 x 3 [~ 20,052,968,255]

Time: 51,357ms [~ 20,052,968,255]

$$\begin{aligned} & 3 \cdot 8 \cdot 20,052,950,074 \text{ bytes} \\ = & 481,270,801,776 \text{ bytes} \\ \approx & \mathbf{481 \text{ GB !!}} \end{aligned}$$

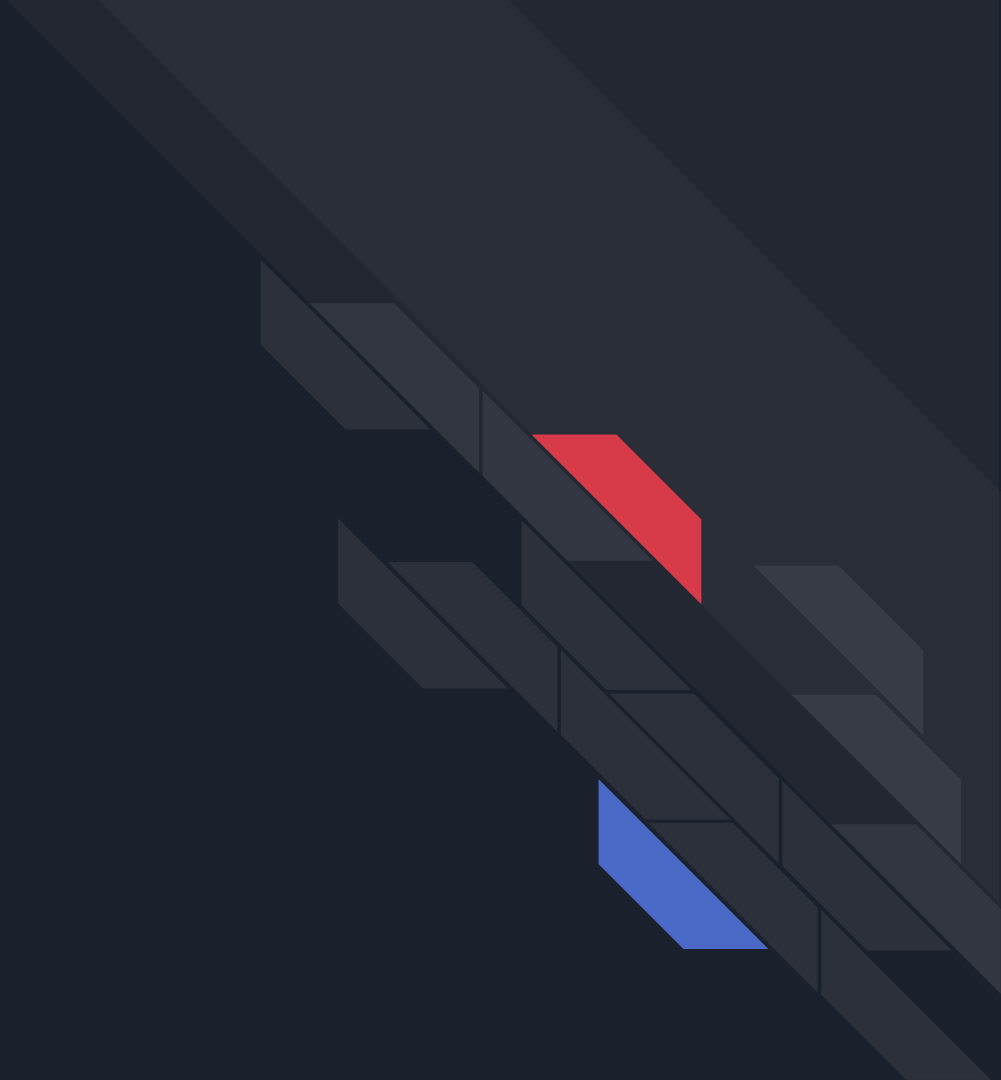
High memory requirement!



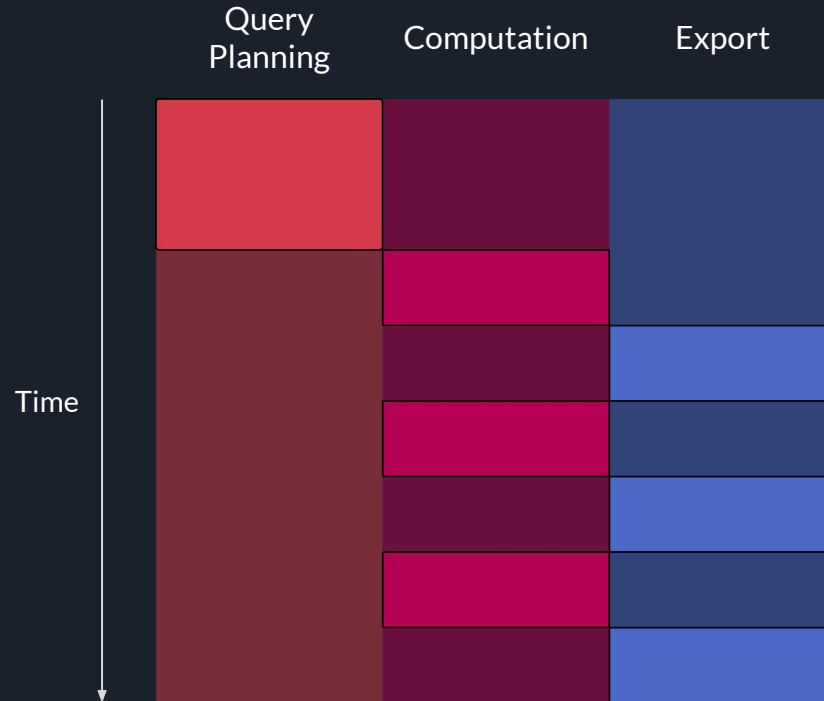
Existing Workaround

```
SELECT * WHERE { ?s ?p ?o } OFFSET          0 LIMIT 10000000
SELECT * WHERE { ?s ?p ?o } OFFSET    10000000 LIMIT 10000000
SELECT * WHERE { ?s ?p ?o } OFFSET    20000000 LIMIT 10000000
SELECT * WHERE { ?s ?p ?o } OFFSET    30000000 LIMIT 10000000
SELECT * WHERE { ?s ?p ?o } OFFSET    40000000 LIMIT 10000000
SELECT * WHERE { ?s ?p ?o } OFFSET    50000000 LIMIT 10000000
SELECT * WHERE { ?s ?p ?o } OFFSET    60000000 LIMIT 10000000
SELECT * WHERE { ?s ?p ?o } OFFSET    70000000 LIMIT 10000000
SELECT * WHERE { ?s ?p ?o } OFFSET    80000000 LIMIT 10000000
SELECT * WHERE { ?s ?p ?o } OFFSET    90000000 LIMIT 10000000
SELECT * WHERE { ?s ?p ?o } OFFSET   100000000 LIMIT 10000000
SELECT * WHERE { ?s ?p ?o } OFFSET   110000000 LIMIT 10000000
...
SELECT * WHERE { ?s ?p ?o } OFFSET 20050000000 LIMIT 10000000
```

Solution



Proposed Processing Model



Code Examples in Different Languages

```
#include <iostream>
#include <string>
#include <ranges>

int main() {
    std::ranges::istream_view<std::string> input{std::cin};
    for (const auto& line : input) {
        std::cout << line << std::endl;
    }
    return 0;
}

using System;

class Cat
{
    static void Main()
    {
        string? line;
        while ((line = Console.ReadLine()) is not null)
        {
            Console.WriteLine(line);
        }
    }
}
```

```
import java.io.BufferedReader;
import java.io.InputStreamReader;
import java.io.IOException;
import java.nio.charset.StandardCharsets;
import java.util.stream.Stream;

public class Cat {
    public static void main(String[] args) throws IOException {
        try (var reader = new InputStreamReader(
            System.in, StandardCharsets.UTF_8);
            var bufferedReader = new BufferedReader(reader)) {
            bufferedReader.lines().forEach(System.out::println);
        }
    }
}

import System.IO (isEOF)

main :: IO ()
main = do
    eof <- isEOF
    if eof
    then return ()
    else do
        line <- getLine
        putStrLn line
    main
```



Challenges of the Thesis

- Implement general mechanism to existing codebase
 - Keep backwards compatibility
 - Keep code architecture largely untouched
- Keep Caching Mechanism
- Identify operations benefiting from new mechanism
- Add actual implementations for suited operations
 - Performance should ideally not regress by much



Demo

FILTER (?a = ?c)

Cols: ?c, ?b, ?a

Size: 17,716,426 x 3 [~ 20,052,968]

Time: 90,680ms [~ 20,073,021,223]

INDEX SCAN ?a ?b ?c

Cols: ?c, ?b, ?a

Size: 20,052,950,074 x 3 [~ 20,052,968,255]

Time: 1,415ms [~ 20,052,968,255]

glever.cs.uni-freiburg.de/wikidata/CkGt4

GROUP BY on ?a

Cols: ?a, ?count (U)

Size: 2,187,234,654 x 2 [~ 2,187,234,560]

Time: 574,101ms [~ 0]

INDEX SCAN ?a ?b ?c

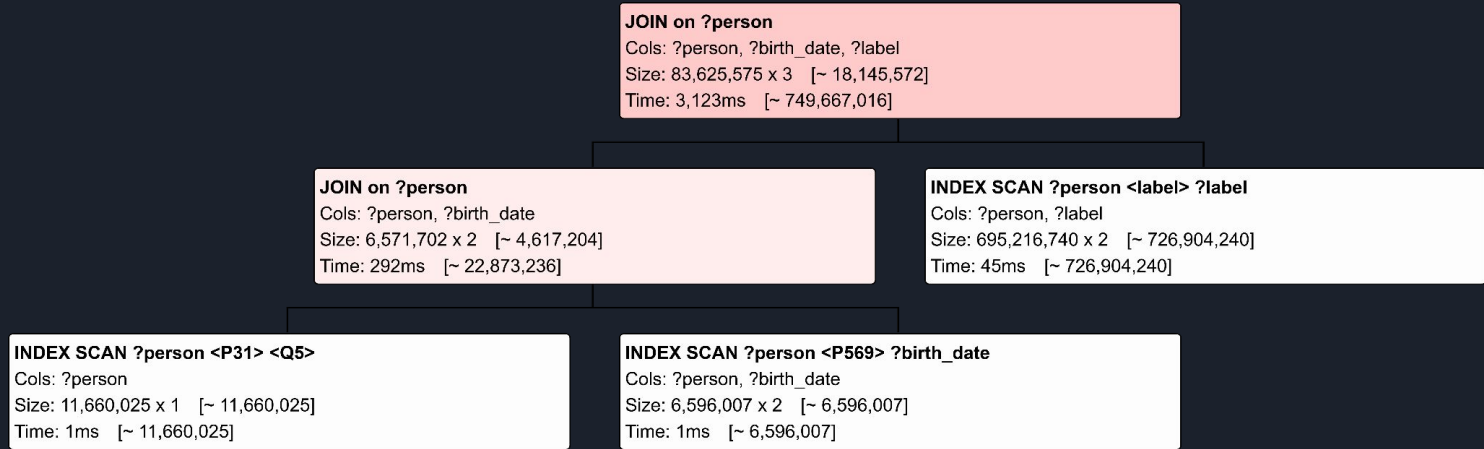
Cols: ?a, ?b, ?c

Size: 20,052,950,073 x 3 [~ 20,052,968,255]

Time: 771ms [~ 20,052,968,255]

glever.cs.uni-freiburg.de/wikidata/msUuJN

Demo



qllever.cs.uni-freiburg.de/wikidata/Zg778r

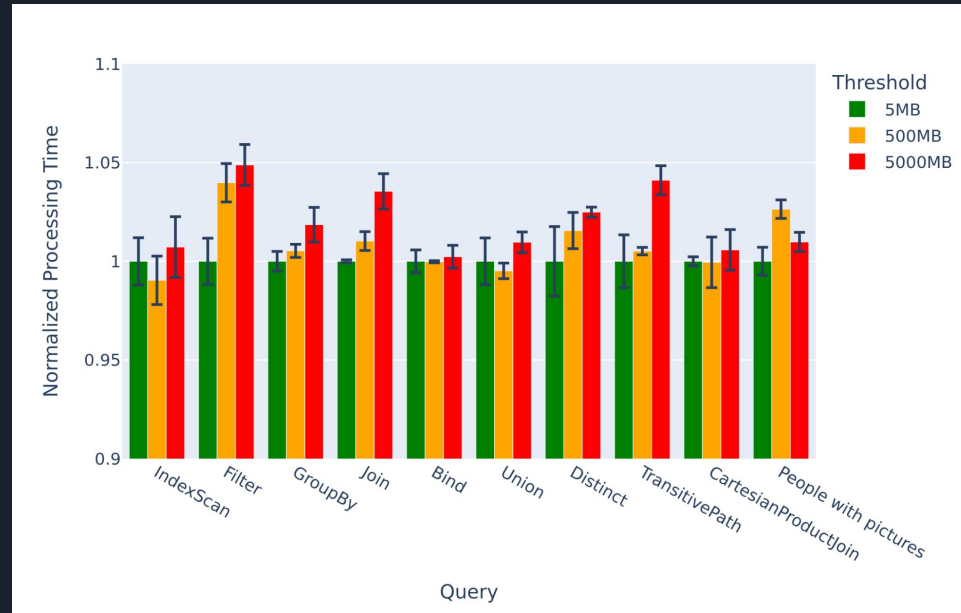
Performance Analysis



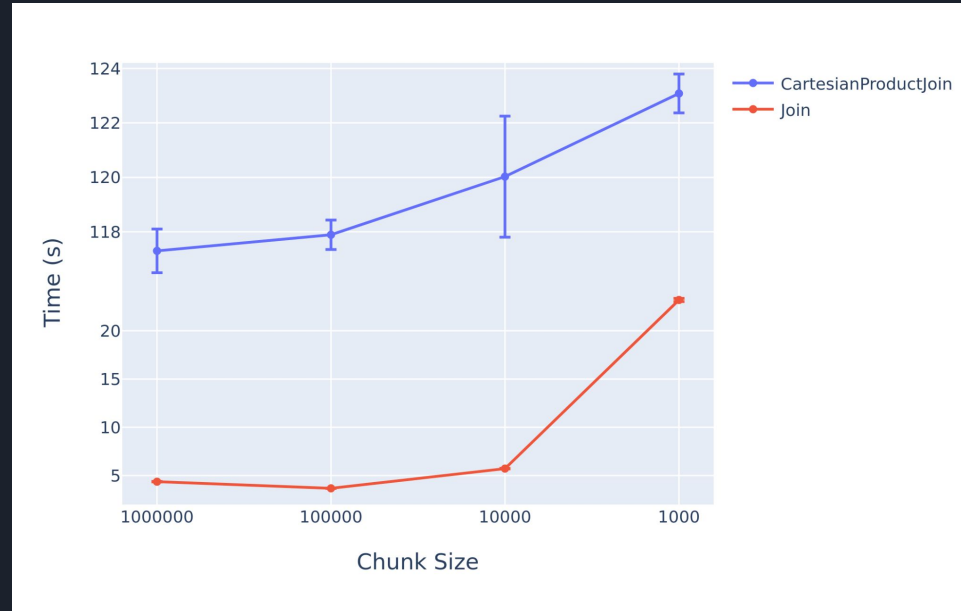
Laziness Performance Overhead


Query	Processing Time		Memory Delta	
	Lazy	Non-Lazy	Lazy	Non-Lazy
<i>IndexScan</i> example	20 s	-	702 MB	> 48 GB
<i>Filter</i> example	127 s	-	702 MB	> 48 GB
<i>GroupBy</i> example	608 s	-	702 MB	> 48 GB
<i>Join</i> example	3715 ms	4833 ms	702 MB	2151 MB
<i>Bind</i> example	447 min	-	1130 MB	> 48 GB
<i>Union</i> example	39 s	-	702 MB	> 48 GB
<i>Distinct</i> example	82 s	-	702 MB	> 48 GB
<i>TransitivePath</i> example	13 s	15 s	702 MB	2244 MB
<i>CartesianProductJoin</i> example	111 s	-	702 MB	> 48 GB
<i>GroupBy</i> example variant	385 ms	-	705 MB	> 48 GB
<i>CartesianProductJoin</i> example variant	144 ms	122 ms	702 MB	702 MB
People with pictures	2342 ms	2222 ms	851 MB	996 MB

Caching Overhead



Chunk Size Impact





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