The QLever UI

+ its connection to other projects in our group
+ a crash course on some knowledge base basics

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- Part 2Connection to other
projects in our group
- Part 3 The Qlever UI

7 slides*

12 slides

4 slides

Lots of examples and demos Please interrupt me at any time if something is not clear

* One of these 7 slides has a list of the progress and features added to the Olever UI over time, and I will spend quite a bit of time on that slide

Knowledge Base Basics 1/12

Knowledge bases, simple version

 A knowledge base can be represented as a collection of subject-predicate-object triples, for example:

<meryl streep=""></meryl>	<is-a></is-a>	<person></person>	
<meryl streep=""></meryl>	<gender></gender>	<female></female>	
<meryl streep=""></meryl>	<date birth="" of=""></date>	"1949-06-22"	
<meryl streep=""></meryl>	<award won=""></award>	<oscar actress="" best=""></oscar>	

 Modeling data as triples is the central element of the Resource Description Framework (RDF) specification; also:

Each part of a triple is an International Resource Identifier (IRI) An IRI is just like a URI, but allowing more characters (ä, 米, ず, …) Objects can also be strings, so-called **literals** Literals can have languages and (basic) data types, see later slide

 RDF is <u>not</u> a data format; what we see above is one of several data formats ("serializations") for RDF data, called **N-Triples** (NT)

Knowledge Base Basics 2/12

- The standard query language is SPARQL
 - A simple example query: all winners of an Oscar for Best Actress in the knowledge base, together with their birth date, youngest first

```
SELECT ?person ?date_of_birth WHERE {
    ?person <Award won> <Oscar Best Actress>
    ?person <Date of birth> ?date_of_birth
}
ORDER BY DESC(?date_of_birth)
```

- Note how the query syntax is similar to the N-Triples input format
 Except that each component of a triple can also be a variable
- The result is a table (one column per variable in the SELECT clause)
 Each row is simply an assignment to the variables such that all the triples in the body of the query exist in the knowledge base
 NOTE: If in the query above, a person has k birth dates, there would be k rows in the table for that person, one for each birth date

Knowledge Base Basics 3/12

Important SPARQL features

 List of features used in many typical queries (by example); understand that in SPARQL each intermediate result is a table

ORDER BY DESC(?year) OPTIONAL { ... } FILTER (?height > 8000)

GROUP BY ?x

{ ... } UNION { ... }

VALUES { ... }

{ SELECT ... }

BIND (?old AS ?new) <birth place>|<nationality> <birth place>/<contained> <contained>*

Order result rows by value of this column enclosed triples can but don't have to match Reduce to rows with specified property Conflate rows with same value for ?x union of two result tables create result table with explicit values Subquery within a query (arbitrarily nestable) Copy result column (or modify with function) Union of two predicates Predicate path of length 2 Transitive hull (+ = at least once)



Knowledge Base Basics 4/12

Knowledge bases

- Our first knowledge base example was oversimplified in two ways
 - 1. The IRIs were short and not universally unambiguous

The same IRI might mean something different in a different knowledge base and then we have trouble when we combine them

2. In real knowledge bases, IRIs do not have human-readable names, but those names are specified via a dedicated predicate

Reason: we want IDs to be stable, but the name of an entity may change + an entity has a different name in different languages

– In Wikidata, Meryl Streep has the (globally unique and stable) IRI <http://www.wikidata.org/entity/Q873>

and the names in the various languages are specified as follows

<http://.../Q873> <http://.../rdf-schema#label> "Meryl Streep"@en . <http://.../Q873> <http://.../rdf-schema#label> "Merila Strīpa"@lv . <http://.../Q873> <http://.../rdf-schema#label> "Мерил Стрип"@ru .

Knowledge Base Basics 5/12

Knowledge bases

– In Wikidata, the information about Meryl Streep looks as follows

We now use the more compact **Turtle** (TTL) format, which has features like IRI prefixes and ; for stating multiple triples for the same subject

@prefix wd: <http://www.wikidata.org/entity>
@prefix wdt: <http://www.wikidata.org/prop/direct/>
@prefix xsd: <http://www.w3.org/2001/XMLSchema#>

@prefix rdfs: <http://www.w3.org/2000/01/rdf-schema#>

wd:Q873	wdt:P31 wdt:P21 wdt:P569 wdt:P166	wd:Q5 wd:Q6581072 "1949-06-22"^^xsd:dateTime wd:Q103618	• • • • • • • • • • • • • • • • • • • •
wd:Q873	rdfs:label	"Meryl Streep"@en	•
wd:Q5	rdfs:label	"human"@en	
wd:Q6581072	rdfs:label	"female"@en	
wd:Q103618	rdfs:label	"Academy Award for Best Actress"@en	

Knowledge Base Basics 6/12

Reification, problem

- The RDF idea of casting everything as triples is very elegant

Compare this to a database where we usually have multiple tables and we need to understand the schema of each table (= what each column means) to understand what the data means

- But consider this information about Meryl Streep's three Oscars:
 - 1980Oscar for Best Supporting Actress"Kramer vs. Kramer"1983Oscar for Best Actress"Sophie's Choice"2912Oscar for Best Actress"The Iron Lady"
- This seems to require an n-ary relation, where n > 2

n = 4 in this case, because each element has four pieces of information: person, year, award, film

 How can we cast this as triples? (which inherently capture only binary information, namely between a subject and an object)

Knowledge Base Basics 7/12

Reification, first try

- Consider the following triples (in the simpler N-Triples format again)

<Meryl Streep> <won award> <Oscar Best Supporting Actress>.<Meryl Streep> <won award> <Oscar Best Actress>.<Meryl Streep> <won award in year> <Meryl Streep> <won award in year> <Meryl Streep> <won award in year> <Meryl Streep> <won award for film> <The Iron Lady> .

- Problem: we have now lost information

The triples tell us that Meryl Streep has won awards in the years 1980, 1983, and 2021. They don't us tell which award in which year for what



Knowledge Base Basics 8/12

Reification, Wikidata solution

- For each element of the n-ary relation, introduce an intermediate entity and connect each component of the element to that node via a normal triple
 In Wikidata, these intermediate entities are called statement nodes
- For example, the statement node for Meryl Streep's 2012 Oscar is called <http://.../statement/Q873-6ad4311a-47f9-8d9b-7c91-d387e71529ac>
- The information about that Oscar is expressed via the following triples
 - @prefix wd: <http://www.wikidata.org/entity/> @prefix wds: <http://www.wikidata.org/entity/statement/> @prefix p: <http://www.wikidata.org/prop/> @prefix ps: <http://www.wikidata.org/prop/statement/> <http://www.wikidata.org/prop/qualifier/> @prefix pq: wd:Q873 wds:Q873-...-d387e71529ac. p:166 wds:Q873-...-d387e71529ac ps:P166 wd:Q103618 . # award pq:P585 "2011-01-01" . wds:Q873-...-d387e71529ac # point in time wds:Q873-...-d387e71529ac wd:Q269810 . # for work pq:P1686

Knowledge Base Basics 9/12

Reification, predicate variants and names

- With reification, the "same" predicate can appear in different roles
- For example, for the Wikidata property for "award received" we have:
 - wdt:P166 from an entity directly to its main property
 p:P166 from an entity to a statement node
 ps:P166 from a statement node to the main property of that statement
 pq:P166 from a statement node to an additional property ("qualifier")
 w five more variants :0
- Technically, these are completely different predicates; but their common suffix (P166) indicates that they have something in common; in particular, they share a common name via a connection to a "meta entity":

wd:P166	rdfs:label	"award received"@en	
wd:P166	wikibase:directClaim	wdt:P166	
wd:P166	wikibase:claim	p:P166	
wd:P166	wikibase:statementProperty	ps:P166	
wd:P166	wikibase:qualifier	pq:P166	

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Interim conclusion

- RDF, stable IDs, name predicates, reification are very elegant ideas Indeed, knowledge bases prior to Wikidata did not implement them so consistently, which really complicated working with them in depth
- But one consequence is that even seemingly simple queries can becomes quite complex in SPARQL, for example

All Oscars of Meryl Streep (and the films she won them for)

Note that this is not a constructed query, but the kind of query which people ask on Google (expecting an informative answer)

Let's look at the correct (and simplest) SPARQL query for this on the next slide

Knowledge Base Basics 11/12

SPARQL query for Meryl Streep's Oscars

PREFIX wd: <http://www.wikidata.org/entity/>
PREFIX wdt: <http://www.wikidata.org/prop/direct/>
PREFIX p: <http://www.wikidata.org/prop/>
PREFIX ps: <http://www.wikidata.org/prop/statement/>
PREFIX pq: <http://www.wikidata.org/prop/qualifier/>
PREFIX rdfs: <http://www.w3.org/2000/01/rdf-schema#>

SELECT ?film ?award WHERE {

wd:Q873 p:P166 ?s .
?s ps:P166 ?award_id .
?s pq:P1686 ?film_id .
?award_id wdt:P31 wd:Q19020 .
?film_id rdfs:label ?film .
?award_id rdfs:label ?award .
FILTER (LANG(?film) = "en")
FILTER (LANG(?award) = "en")
}

- . # to statement node
- . # award
 - # for work
- . # instance of
 - . # name
 - . # name
 - # only English name
 - # only English name

Observations



1. This is by far not everything: there are yet **more subtleties** and challenges when working with knowledge bases

2. These are **not design flaws**; rather, representing large amounts of knowledge in a structured way has an inherent complexity

- What about natural language, does it have the same problems?

3. It is indeed the beauty of natural language that it allows to capture this complexity (and more) in a very **flexible** way, **without strict rules**

4. There is a price: natural language is inherently **fuzzy**; one can make 100% precise statements in natural language, but that takes effort

5. Also, there is no way that one can extract complex information from a text collection as **precisely** as from a knowledge base

This is why I strongly believe that both text **and** knowledge bases are important, and no amount of AI will change that (in the next 50 years)

Other projects in our group 1/4

Question Answering

- To answer questions from a knowledge base, we need to translate a natural language query to its "logical form", e.g., a SPARQL query
 → work by Elmar, Niklas, Thomas (Aqqu) + hopefully more of you
- Our work on the QLever UI is relevant for that in two respects

1. To be able to translate a question to a SPARQL query, we need to understand the challenges and subtleties of SPARQL queries

2. An intelligent and functioning SPARQL autocompletion is actually a big step towards question answering, for the following reason:

- A good autocompletion allows the construction of a SPARQL query with minimal user input and little and simple user interaction
- A question can be seen as minimal user input, so all that remains is to automate the user interaction part
- More generally, understanding the intricacies of knowledge bases and SPARQL helps to deeper understand natural language processing

Other projects in our group 2/4

Combination with text search

 QLever is unique for its capabilities to search in text combined with a knowledge base; here are some sub-problems:

Entity Linking: To combine text with a knowledge base, we need to recognize and disambiguate entity mentions (also co-references like "he", "she", "it", "the film") in the text \rightarrow work by Matthias and Natalie

Text extraction from PDF: Much text is available in the form of PDFs, but it is very hard to extract text (and semantic information like what is a header) from PDFs; this has nothing to do with the particular PDF standard, it's an inherent problem \rightarrow talk by Claudius in November

Error correction: Errors and wrong spacing are a big issue, for any text produced by humans and also for text extracted from PDFs; if this is not fixed, we get zero results \rightarrow work by Markus, Matthias, Mostafa

Note that error correction is not only relevant for text search, but also for SPARQL queries, question answering, and autocompletion!

Other projects in our group 3/4

- Efficiency
 - Interacting with a knowledge base is no fun (or infeasible) if it takes forever to build an index or ask queries

QLever query engine: Fast index construction, basic architecture, query planning, efficient support of the many SPARQL features → work by Björn, Niklas, Florian (Kramer), Johannes

Autocompletion: Suggestions are only fun when they are <u>very</u> fast \rightarrow work by Niklas, Johannes, Theresa

User Interfaces

- Important to easily interact with the data and understand it, which is the foundation of much of our other work + as mentioned earlier, an important step towards question answering
 - → work by Florian (Bäurle), Björn, Elmar, Johannes, Daniel (Kemen), Julian (Bürklin), Simon (Selg), Natalie, Theresa

More about the QLever UI in the third part of this talk

Other projects in our group 4/4

Domain-specific knowledge bases

 Building knowledge bases for each particular domain has its own challenges, especially when the knowledge bases are huge

Freebase and Clueweb: this was a <u>huge</u> challenge at the time (3.1B triples, 23.4B words) \rightarrow work by Elmar and Björn

Wikidata: it took us a year to enable QLever to index the complete Wikidata (13B triples) in less than a day without using huge amounts of RAM \rightarrow work by Niklas and Johannes

OpenStreetMap: ongoing project with its own challenges because of the huge number of objects and the geometrical data \rightarrow work by Axel and Patrick (our OSM expert)

Publication data / DBLP: our first search engine in 2006 still powers the DBLP publication search; in the meantime, there is also an RDF dump of the data \rightarrow see end of the talk

The QLever UI 1/7

Goal

 Provide interactive suggestions in order to write a SPARQL query with the desired result as **effortlessly** and as **quickly** as possible

Realization

- When we started this work, we constructed all kinds of auxiliary data structures to make these suggestions sufficiently fast
- Eventually, we realized that **all** suggestion queries could be formulated as SPARQL queries and instead of building special-purpose data structures, we improved QLever to process the Autocompletion SPARQL queries efficiently

As a nice side effect, many useful features (that were missing so far) were added to QLever and many operations were sped up significantly

Two birds with one stone: no need for a separate autocompletion engine and a better SPARQL engine

The QLever UI 2/7

SPARQL autocompletion via SPARQL 1/3

 For example, assume that we have typed the following incomplete query and are looking for suggestions for **objects** (cursor at _)

```
SELECT ... WHERE {
  wd:Q873 wdt:P166 A_  # Meryl Streep award won
}
```

- Then we can get these suggestions via the following SPARQL query

```
SELECT ?object ?name ?score WHERE {

wd:Q873 wdt:P166 ?object .

?object skos:altLabel|rdfs:label ?name .

?object ^schema:about/wikibase:sitelinks ?score .

FILTER REGEX(?name, "^A")

} ORDER BY DESC(?score)
```

Recall: the | operator takes the union of two predicates; the ^ operator reverses a predicate; the / operator expresses a "path" via an intermediate object which we don't care about

The QLever UI 3/7

SPARQL autocompletion via SPARQL 2/3

 Now assume that we have typed the following incomplete query and are looking for suggestions for **predicates** (cursor at _)

```
SELECT ... WHERE {
  wd:Q873 p:P166 ?s. # Meryl Streep award won
  ?s __
}
```

The QLever UI 4/7

SPARQL autocompletion via SPARQL 3/3

 Now assume that we have typed the following incomplete query and are looking for suggestions for **predicates** (cursor at _)

```
SELECT ... WHERE {
    ?x _
}
```

- Then we can get these suggestions via the following SPARQL query

```
SELECT ?predicate ?name ?score WHERE {
  { SELECT ?predicate (COUNT(?object_tmp) AS ?score) WHERE {
     ?x ?predicate ?object_tmp .
  } GROUP BY ?predicate }
  ?meta_tmp ?connect_tmp ?predicate .
  ?meta_tmp rdfs:label ?name .
} ORDER BY DESC(?score)
```

The **?x ?predicate ?object_tmp** query looks like we have to scan the whole index, that looks infeasible

The QLever UI 5/7

- Challenges and progress over time
 - Provide all suggestions via SPARQL
 - Use names and aliases from the knowledge base
 - Ranking via information from the knowledge base
 - Context-sensitive suggestions
 - Essential SPARQL features added or made efficient
 - Efficient support for ql:has-predicate
 - Caching and memory efficiency and awareness
 - Sophisticated evaluation benchmarks and suite
 - Template mechanism for suggestion queries
 - Suggestion of reverse predicates
 - Timeout with fallback to context-agnostic suggestions
 - Automatic addition of name triples and select variables
- 23 Map UI ... with recursive clustering for large result sets ta

example previous slide example previous slide example previous slide

> talk on its own talk on its own talk on its own talk on its own

inside Qlever UI?

talk on its own

What is still missing?

 Despite all the great progress, for some queries, it is still hard to guess how certain pieces of information are represented in the knowledge base:

Transitivity: To get all entities of a certain type, we often need constructs such as wdt:P31/wdt:P279* ... e.g.: all cities

It would be great if the UI could automatically realize that such a predicate path is appropriate or needed ... but how?

One-hop connections: Sometimes, finding the predicate to get to the right statement node can be very unintuitive ... e.g.: members Bundestag

It would be great if we could specify the kind of entity we want to **reach** and than the UI suggests how to get there ... but how?

Clumsy SPARQL constructs: several intuitive notions are <u>very</u> clumsy to express in SPARQL; in particular, SPARQL queries that require a GROUP BY are always a pain ... e.g.: Bundestag members and their party

Idea: context-sensitive suggestions of whole constructs (not just components of a triple) for extending a query

The QLever UI 7/7

- Let's do some live queries together
 - Think of some interesting list or table of information that can be extracted from Wikidata or OpenStreetMap

With or without relation to a map, as you like

- Then let us try to find the correct SPARQL query using the Qlever UI