# Protocol Conformance of Collaborative SPARQL using Multiparty Session Types

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Abstract. Decentralised linked data gives users rights over their data while being accessible to other domains. The RDF (Resource Description Framework) and SPARQL have been the standard specifications for managing linked data for several years. Recent research and development introduce scalable, centralised and distributed RDF store engines with the SPARQL. However, writing SPARQL federated queries may grow more complex as the number of domain participants increases, presenting challenges such as source discovery, completeness and performance. This paper presents a SPARQL Query Template (SQT) that applies Multiparty Session Types (MPST) to determine the order of federated queries. We also guarantee protocol conformance between MPST and SPARQL relational algebra.

**Keywords:** Multiparty session types  $\cdot$  SPARQL  $\cdot$  Federated Query  $\cdot$  Protocol Conformance

## 1 Introduction

The RDF (Resource Description Framework) and SPARQL 1.1<sup>1</sup> are the two W3C recommended standards for querying and manipulating linked data on the Web. Since SPARQL's introduction in 2008, significant research and technological advancements have supported RDF and SPARQL specifications. Many RDF repositories, such as DBpedia, UniProt (Universal Protein Resource) and Rhea, are publicly available to provide information from diverse domains [1–6]. DBpedia, for example, contains around 900 million triplets as of January 2021<sup>2</sup> and maintains a distributed infrastructure that extracts approximately 5500 triplets per second and 21 billion triples per release. In real-world applications, RDF datasets are often partitioned and built upon distributed environments [7].

There has been rigorous work on handling massive RDF datasets. One way to manage the datasets is by partitioning and distributing them under the same RDF engine or by decentralising them on domain-specific repositories. The latest distributed RDF engine implemented with a custom communication protocol has shown superior performance compared to other centralised or MapReduce-based engines [7–16]. In addition, SPARQL 1.1 federated query allows merging

<sup>1</sup> https://www.w3.org/TR/sparql11-overview/

https://www.dbpedia.org/resources/latest-core/

data across decentralised repositories and heterogeneous RDF engines. Federated query processors have been improved in many aspects, including querying documents, query planner optimisation and sensitive data access policies [17–23]. A federated query execution framework depends on source selection as it determines which endpoints are relevant to evaluate a given query. The Source selection is a separate step before execution, aiming to reduce the number of requests to the RDF server, optimise resource allocations and minimise network overhead, improving overall query execution time.

Well-specified communication is crucial for distributed RDF engines and federated queries, leading to significant performance increases. For communication-focused programming, a framework of Multiparty Session Types (MPST) provides a typed process that abstracts communication between multiple participants into a global protocol (type) [24]. The theory formalise endpoint projection of the global description in the Web Services Choreography Description Language<sup>3</sup>, but it can accommodate other diverse specifications [25]. We aim to integrate this typed theory with SPARQL. This theory matches common issues in the software development process and is essential for a collaborative team of engineers writing SPARQL. A global type (protocol) gives engineers a global view of federated query communication between RDF repositories. The engineers can validate their SPARQL federated query following a global protocol.

We highlight current SPARQL issues as follows. (1) Source discovery: Writing a SPARQL query that involves many RDF repositories and complex query joins can be burdensome; and (2) Performance and completeness: Query execution time depends on the performance of SPARQL runtime and federated communication cost. More importantly, the query must return a complete result.

This paper introduces a novel SPARQL Query Template (SQT) generator that leverages the benefits of Multiparty Session Types [24, 26, 27]. The theory notably gives some clarity to complex processes. The SQT generates federated query body syntax that includes the RDF URL source address and guarantees conformance with the projection of a given global type. Moreover, by using a global type to describe communication patterns, we can identify and prevent overhead communications, speed up query execution and ensure the completeness of the results.

In the remainder, Section 2 gives preliminaries of RDF, MPST and SPARQL relational algebra through examples. Section 3 illustrates a use case that motivates this work. We explain in detail how SQT produces query templates from a global type. Section 4 explains how local types conform to relational algebra. Section 5 evaluates different network communication costs associated with different implementations. Finally, Section 6 discusses current limitations and future works of current work.

<sup>3</sup> https://www.w3.org/2002/ws/chor/

# 2 Preliminaries and Examples

This section introduces RDF notations, SPARQL relational algebra and MPST through simple examples.

#### 2.1 RDF and SPARQL

Our basic definitions of RDF and SPARQL follow [28, 29]. In addition, we add a representation of RDF graph [16] and conjunctive query [7].

**Definition 1 (RDF Triple).** RDF terms (t) are consist of IRIs (I), literals (L) and blank nodes (B). These terms form a triple or 3-tuple,  $\langle t_s, t_p, t_o \rangle \in (\mathbf{I} \cup \mathbf{B}) \times (\mathbf{I}) \times (\mathbf{I} \cup \mathbf{B} \cup \mathbf{L})$ , where s, p and o denote subject, predicate and object of the triple,  $\beta = \{s, p, o\}$ .

A set of RDF triples indicates a semantic relationship between terms and can be represented as a directed graph [16]. We can construct and label multiple graphs into a dataset. However, for convenience, this paper focuses on a single graph in a dataset.

**Definition 2 (RDF Dataset).** Dataset (D) is a set of triples. The semantic relationship on triples can be described as a directed labelled graph. A graph consists of vertices (V) and directed edges (E), denoted by  $D = \{V, E\}$ . Vertices V denotes a set of resource nodes  $t_s \cup t_o \in V$ . Edges E is a set of directed edges connecting the nodes in V. To simplify, the directed edge  $t_s \stackrel{t_p}{\to} t_o$  is expressed by  $\langle t_s, t_p, t_o \rangle$ .

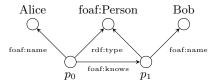


Fig. 1: RDF Dataset

Example 1. To illustrate, we define a dataset carrying a relation between Alice and Bob, presented as vertices and directed edges as shown in Fig. 1.

```
\begin{split} D = & \{V, E\} \\ V = & \{\text{Alice, Bob, foaf:Person}, p_0, p_1\} \\ E = & \{\langle p_0, \text{foaf:knows}, p_1 \rangle \,, \langle p_0, \text{rdf:type, foaf:Person} \rangle \,, \\ & \langle p_1, \text{rdf:type, foaf:Person} \rangle \,, \langle p_0, \text{foaf:name, Alice} \rangle \,, \langle p_1, \text{foaf:name, Bob} \rangle \} \end{split}
```

**Definition 3 (SPARQL Query Template).** The SPARQL Query Template (SQT) syntax is denoted as follows:

The SPARQL relational algebra formally defines a query language semantics [7,28,29]. A query's result or solution is a tuple containing variables from queries matched against the RDF dataset. This paper recursively constructs queries from graph patterns, including triple patterns, basic graph patterns and service federation.

**Definition 4 (Triple Pattern or Atom).** Triple pattern or atom (A) forms  $\langle t_s, t_p, t_o \rangle \in (\mathbf{I} \cup \mathbf{B} \cup \mathbf{V}) \times (\mathbf{I} \cup \mathbf{V}) \times (\mathbf{I} \cup \mathbf{B} \cup \mathbf{L} \cup \mathbf{V})$  where (**V**) refers to variables. The variables occurring in an atom are denoted by vars(A). The triple pattern evaluates RDF triples in D by selection function ( $\sigma$ ) with constant terms  $t_k$  and by mapping function ( $\pi$ ) that maps terms  $t_i$  to the variables  $v_i$ :

$$A ::= \pi_{v_i \leftarrow t_j}(\sigma_{t_k}(D)) \qquad (j, k \in \beta \text{ and } i \in \mathbb{N})$$

$$vars(A) = \{t_\beta | t_\beta \cap \mathbf{V}\} \qquad (t_k \in (\mathbf{I} \cup \mathbf{B} \cup \mathbf{L}) \text{ and } t_j \in (\mathbf{I} \cup \mathbf{B} \cup \mathbf{L} \cup \mathbf{V}))$$

Example 2. A query for finding a person's name on dataset D is defined as:

This query translates to the relational operation:

$$\langle x, \text{ foaf:name}, y \rangle = \pi_{x,y \leftarrow t_s, t_o}(\sigma_{t_n = \text{foaf:name}}(D))$$

The process begins with searching any triples in a dataset that match the selection's predicate,  $t_p = \text{foaf:name} \in \mathbf{I}$ . Here, we have two variables  $?\mathbf{x}$  and  $?\mathbf{y}$  in subject and object respectively. Subject  $t_s \in \mathbf{I} \cup \mathbf{B} \cup \mathbf{V}$  and object  $t_o \in \mathbf{I} \cup \mathbf{B} \cup \mathbf{L} \cup \mathbf{V}$  intersect with  $\mathbf{V}$  and will be included in  $vars(A) = \{t_s, t_o\}$ .

**Definition 5 (Basic Graph Pattern).** The basic graph pattern is a group of triple patterns. It can be expressed syntactically as a conjunctive query Q from finite set atoms, where vars(Q) denotes variables occurring in the basic graph pattern.

$$Q ::= A_1 \wedge \cdots \wedge A_n$$
 and  $vars(Q) = vars(A_1) \cup \cdots \cup vars(A_n)$ 

Multiple triple patterns stacked together will construct a basic graph pattern [7]. The basic graph pattern variables are the union of all triple pattern variables. These graph patterns can be evaluated in a local or remote dataset, formalised in Definition 6 [29]. The definition of set variables also applies equally to remote datasets.

**Definition 6 (Service Federation).** The SPARQL service (S) is a query evaluation on a remote dataset. Query evaluation Q on remote service S is denoted as (S,Q) while local query evaluation is denoted as (Q).

The SPARQL query Q is evaluated over dataset D and then returns solution mapping that represents matched variables on triples in a dataset [29]. The solution mapping function is defined in Def. 7. We assume all variables are bounded and no error returns from the graph pattern.

**Definition 7 (Solution Mapping Function).** A solution mapping  $(\pi)$  partially maps variables V from terms  $I \cup B \cup L$ . Suppose  $\{v_i, \ldots, v_n\} \subseteq V$  and  $\{x_i, \ldots, x_n\} \subseteq vars(Q)$  for  $n \in \mathbb{N}$ . Then we denote by  $\{v_i/x_i, \ldots, v_n/x_n\}$  mapping function  $\pi$  such that the solution contains a set of  $dom(\phi) = \{v_i|x_i\}$ .

$$\pi_{v_i} = x_i \quad (v_i \in dom(\pi)) \qquad and \qquad \pi_{\emptyset} = \emptyset \quad (dom(\pi) = \emptyset)$$

Example 3. Assume there are two datasets. The local dataset contains triples of persons. The remote dataset contains people's relations with each other. The first graph pattern is evaluated locally and the second pattern is service federation, which is evaluated on a remote dataset as shown in Fig. 2. The local graph pattern finds subject terms with type foaf:Person and map into variable  $?x \in I$ . Then, a service federation pattern finds the person  $?y \in I$  that is acquainted with ?x. A complete query syntax is presented in Fig. 3.

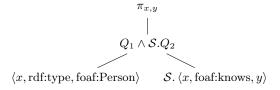


Fig. 2: SPARQL relational algebra

Fig. 3: SPARQL 1.1 Query

#### 2.2 Multiparty Session Types

Global types (protocol) G provides a blueprint describing communication between participants as a pair of a sender and a receiver [24, 26, 27]. In Definition 8, message type formalises protocol where p sends to q a value with type U. Similarly, branching type formalises participant p chooses a label  $l_i$  from q for some  $i \in I$ . The termination type end denotes communication is finished and no further process.

**Definition 8 (Global and Local Types).** The global type G and local type T are denoted as follows:

```
\begin{split} G &\coloneqq \mathbf{end} \; \middle| \; \mathbf{p} \to \mathbf{q} : [U] \, ; G \; \middle| \; \mathbf{p} \to \mathbf{q} : \left\{ l_i : G_i \right\}_{i \in I} \; \textit{(termination, message, branching)} \\ T &\coloneqq \mathbf{end} \; \middle| \; \mathbf{q}! \, [U]; T \; \middle| \; \mathbf{p}? \, [U]; T \; \textit{(termination, send, receive)} \\ & \middle| \; \mathbf{q} \oplus \left\{ l_i : T_i \right\}_{i \in I} \; \middle| \; \mathbf{p} \& \left\{ l_i : T_i \right\}_{i \in I} \; \textit{(internal choice, external choice)} \end{split}
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We require that  $p \neq q$ ,  $I \neq \emptyset$ , and  $i \neq j$  whenever  $i \neq j$ , for all  $i, j \in I$ .

Local type T defines a process for a single participant following a global type G [24, 26, 27]. Termination type (end) denotes the end of a process. Send type  $\mathbf{q}![U];T$ , sends a message to  $\mathbf{q}$  with payload U. Receive type  $\mathbf{p}![U];T$ , waits for a message from  $\mathbf{p}$  with payload U. External choice  $\mathbf{p}\&\{l_i:T_i\}_{i\in I}$  waits for selection label  $l_i$  from local type to  $\mathbf{p}$  to continues. Internal choice  $\mathbf{q}\oplus\{l_i:T_i\}_{i\in I}$  formalises a label selection  $l_i$  at  $\mathbf{q}$  and continues.

**Definition 9 (Participants).** We define the set of participants of a global type G as follows:

```
\begin{array}{c} pt(\mathbf{end}) = \emptyset \\ pt(\mathtt{p} \rightarrow \mathtt{q} : [U] \, ; G) = \{\mathtt{p}, \mathtt{q}\} \cup pt(G) \\ pt(\mathtt{p} \rightarrow \mathtt{q} : \{l_i : G_i\}_{i \in I} \, ; G) = \{\mathtt{p}, \mathtt{q}\} \cup \bigcup_{i \in I} pt(G_i) \end{array}
```

A set of participants in *message type* is their sender p and receiver q which are defined in a global type. Similarly, for *branching type*, a set of participants is the label sender p and label receiver q. A *branching type* has multiple continuations  $G_i$  and the set of participants is a union from all branches. A *termination type* does not have continuation and does not involve any participants.

**Definition 10 (Projection).** The projection of a global type G onto a participant  $\mathbf{r}$  is defined as follows:

$$\begin{aligned} \mathbf{end} \upharpoonright \mathbf{r} &= \mathbf{end} \\ \mathbf{p} &\to \mathbf{q} : [U] ; G \upharpoonright \mathbf{r} = \begin{cases} \mathbf{q} ! [U] ; G \upharpoonright \mathbf{r} \quad \mathbf{r} = \mathbf{p} \\ \mathbf{p} ? [U] ; G \upharpoonright \mathbf{r} \quad \mathbf{r} = \mathbf{q} \\ G \upharpoonright \mathbf{r} \quad \mathbf{r} \notin \{\mathbf{p}, \mathbf{q}\} \end{cases} \\ \mathbf{p} &\to \mathbf{q} : \{l_i : G_i\}_{i \in I} ; G \upharpoonright \mathbf{r} = \begin{cases} \mathbf{q} \oplus \{l_i : G_i \upharpoonright \mathbf{r}\}_{i \in I} \quad \mathbf{r} = \mathbf{p} \\ \mathbf{p} \& \{l_i : G_i \upharpoonright \mathbf{r}\}_{i \in I} \quad \mathbf{r} = \mathbf{q} \\ \sqcap_{i \in I} G_i \upharpoonright \mathbf{r} \quad \mathbf{r} \notin \{\mathbf{p}, \mathbf{q}\} \end{cases} \end{aligned}$$

A global type can be projected into a local type of participant  $G \upharpoonright \mathbf{r} = T_{\mathbf{r}}$ . The termination type end does not transform during the projection. The projection of message type becomes a send type where  $\mathbf{r} = \mathbf{p}$ ,  $\mathbf{r}$  is a sender and becomes a receive type where  $\mathbf{r} = \mathbf{q}$ ,  $\mathbf{r}$  is a receiver. The branching type is projected to an external choice where  $\mathbf{r} = \mathbf{p}$  and into an internal choice where  $\mathbf{r} = \mathbf{q}$ . Projection of branching type to the third participant  $\mathbf{r}$ , neither  $\mathbf{p}$  nor  $\mathbf{q}$ , must specified to have the same continuation for any branch label.

**Definition 11 (Global Type Reduction).** Evaluating  $p \rightarrow q$  in global type G is defined as follows:

 $(message\ reduction)$   $(\mathbf{p} \to \mathbf{q}: [U]; G) \setminus \mathbf{p} \xrightarrow{U} \mathbf{q} = G$   $(pass\ message\ reduction)$   $(\mathbf{r} \to \mathbf{s}: [U]; G) \setminus \mathbf{p} \xrightarrow{U'} \mathbf{q} = \mathbf{r} \to \mathbf{s}: [U]; (G \setminus \mathbf{p} \xrightarrow{U'} \mathbf{q})$   $if \{\mathbf{r}, \mathbf{s}\} \cap \{\mathbf{p}, \mathbf{q}\} = \emptyset \ and \{\mathbf{p}, \mathbf{q}\} \subseteq G$   $(branching\ reduction)$   $(\mathbf{p} \to \mathbf{q}: \{l_i: G_i\}_{i \in I}) \setminus \mathbf{p} \xrightarrow{l} \mathbf{q} = G_i \quad for\ l = l_i$   $(pass\ branching\ reduction)$   $(\mathbf{r} \to \mathbf{s}: \{l_i: G_i\}_{i \in I}) \setminus \mathbf{p} \xrightarrow{l} \mathbf{q} = \mathbf{r} \to \mathbf{s}: \{l_i: G_i \setminus \mathbf{p} \xrightarrow{l} \mathbf{q}\}_{i \in I}$   $if \{\mathbf{r}, \mathbf{s}\} \cap \{\mathbf{p}, \mathbf{q}\} = \emptyset \ and \ \forall i \in I: \{\mathbf{p}, \mathbf{q}\} \subseteq G_i$ 

Message reduction  $\mathbf{p} \stackrel{U}{\to} \mathbf{q}$  reduces the global type G with message type  $\mathbf{p} \to \mathbf{q}$ : [U] and continues to the next protocol G. Branching reduction  $\mathbf{p} \stackrel{l}{\to} \mathbf{q}$  reduces multiple label selection  $\mathbf{p} \to \mathbf{q}$ :  $\{l_i:G_i\}_{i\in I}$  by choosing one label  $l_i$  then continue with  $G_i$ . Pass reduction applies when participants of reduction  $\{\mathbf{p},\mathbf{q}\}$  do not meet  $\{\mathbf{r},\mathbf{s}\}$  such as reduction  $\mathbf{p} \stackrel{U}{\to} \mathbf{q}$  on  $\mathbf{r} \to \mathbf{s}$ : [U] or  $\mathbf{p} \stackrel{l}{\to} \mathbf{q}$  on  $\mathbf{r} \to \mathbf{s}$ :  $\{l_i:G_i\}_{i\in I}$ . The reduction continues through the rest of the global type until it meets the same participant.

#### 3 Overview

Many research institutes [1–6] provide open RDF datasets. These datasets are often used towards drug discovery. Researchers use them to work with genomic, metabolomic, molecular structures, reaction pathways and screening drug candidates. The information resides in different domains and locations. Data integration and retrieval are the keys to comprehensive analyses. The SPARQL federated query techniques allow engineers to query remote datasets like a single unified database.

We use UniProt query example number  $45^4$  to cover all discussions in this paper. The use case describes a query of retrieving drug targets for human enzymes involved in sterol metabolism. The example uses three SPARQL endpoints, Rhea<sup>5</sup>, UniProt<sup>6</sup> and Wikidata<sup>7</sup>. The query can be run directly at UniProt query editor. Alternatively, it can be executed in Rhea or Wikidata but requires

<sup>4</sup> https://sparql.uniprot.org/.well-known/sparql-examples/?offset=40

<sup>5</sup> https://sparql.rhea-db.org/sparql

<sup>6</sup> https://sparql.uniprot.org/sparql

https://query.wikidata.org/sparql

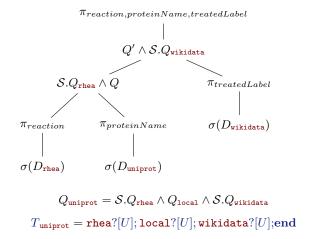


Fig. 4: The relational algebra of retrieving drug targets for human enzymes involved in sterol metabolism

some rewriting at the federated query part. We aim to make it less tiring to write a federated query by modelling this in a global type.

We present a query relational algebra and its local type representation in Fig. 4. The query involves three participants: rhea, uniprot and wikidata. Query  $Q_{\rm uniprot}$  is evaluated at uniprot. Conjunctive query  $Q_{\rm uniprot}$  consists of two service federations and a local graph pattern. The query evaluation follows the sequence: Rhea, UniProt and Wikidata. First, uniprot evaluates federated query at rhea and retrieves reactions involving some molecules. Then, it joins the result with a local query at uniprot to find human enzymes that catalyse reactions. Finally, uniprot finds the interaction of enzymes from previous results with drug descriptions in wikidata. It is important to note that query  $Q_{\rm uniprot}$  and local type  $T_{\rm uniprot}$  are specifications for uniprot only. Other participants will need a different query algebra and a local type definition. The global type provides a global view and ensures accurate and consistent results across all participants during query execution.

## 4 Implementation of SQT Workflow

This section explains the workflow used to generate the SPARQL Query Template. The top-down diagram in Fig. 5 shows the process from global type to query template. We define global type G with four participants: rhea, uniprot, wikidata and local. The local participant physically does not exist. Instead, local acts as rhea, uniprot or wikidata.

We begin with building a global type G, in Example 4, using the Scribble script defined in Fig. 6. Suppose a script Payload() from p to q; the participant q expects a message return from p. This is defined as  $p \to q : [U]$  where payload U contains free tuples of terms  $t_{\beta}$ . Here, p is a participant who owns a dataset and executes query Q either in a local or remote environment.

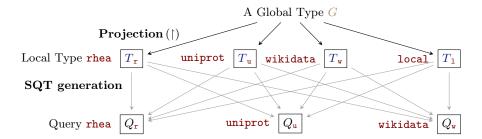


Fig. 5: Top-down view of global type for UniProt query number 45. The r stand for rhea, u for uniprot, w for wikidata and 1 stand for local

The global type is implemented in Scribble script in Fig. 6. Lines 4-8 represents  $G_{\mathtt{rhea}}$  a choice of local acts as  $\mathtt{rhea}$ , lines 18-22,  $G_{\mathtt{uniprot}}$  where local as  $\mathtt{uniprot}$  and lines 32-36,  $G_{\mathtt{wikidata}}$  where local as  $\mathtt{wikidata}$ . Implementation of  $\mathtt{rhea}$  evaluates query locally shown in line 10 and federated query in line 11. The definition of global type G is required to be projectable. Otherwise, it cannot produce any local types T and queries Q.

We introduce a broadcast type with the global type definition. The broadcast type formed as a sequence of branching type and uses one label that same as the previously selected branch. In Definition 12, participant  $\mathbf{p}$  broadcast a  $l_i$  to  $\bar{\mathbf{q}}$  is expressed by selecting a label  $l_i$  to a finite set number of participant  $\bar{\mathbf{q}} = \{\mathbf{q}_1, \mathbf{q}_2, \dots \mathbf{q}_n\}$ .

**Definition 12 (Broadcast Type).** A broadcast type is sending or selecting the same label to multiple participants. A complete set of global type syntax with broadcast type is given as follows:

$$G \coloneqq \mathbf{end} \quad | \quad \mathbf{p} \to \bar{\mathbf{q}} : [U] ; G \qquad \qquad (termination, \ message)$$

$$\mid \quad \mathbf{p} \to \bar{\mathbf{q}} : \{l_i : G_i\}_{i \in I} \qquad \qquad (branching)$$

$$\mathbf{p} \to \bar{\mathbf{q}} : [U] ; G \stackrel{def}{=} \quad \mathbf{p} \to \mathbf{q}_1 : [U] ; \mathbf{p} \to \mathbf{q}_1 : [U] ; \dots$$

$$\mathbf{p} \to \mathbf{q}_n : [U] ; G \qquad \qquad (broadcast \ message)$$

$$\mathbf{p} \to \bar{\mathbf{q}} : \{l_i : G_i\}_{i \in I} \stackrel{def}{=} \quad \mathbf{p} \to \mathbf{q}_1 : \{l_i : \mathbf{p} \to \mathbf{q}_2 : \{l_i : \dots$$

$$\mathbf{p} \to \mathbf{q}_n : \{l_i : G_i\}\}_{i \in I} \qquad (broadcast \ branching)$$

$$with \ \bar{\mathbf{q}} = \quad \{\mathbf{q}_1, \mathbf{q}_2, \dots, \mathbf{q}_n\} \qquad n \in \mathbb{N}$$

The broadcast reduction evaluates communication between participants of a broadcast type in global type G or continues to go through the next types when participants involved in broadcast type differ from the reduction criteria. Reducing branching type  $\mathbf{p} \stackrel{l_i}{\to} \mathbf{q}_1$  or  $\mathbf{p} \stackrel{l_i}{\to} \mathbf{q}_2$  in global type G can happen individually in a different order, but a broadcast reduction must reduce all  $\bar{\mathbf{q}}$  together.

**Definition 13 (Broadcast Reduction).** Evaluating a broadcast type in a global type G is defined as follows:

 $(message\ reduction)$   $(\mathbf{p} \to \bar{\mathbf{q}} : [U]; G) \setminus \mathbf{p} \xrightarrow{U} \bar{\mathbf{q}} \cong G$   $(pass\ message\ reduction)$   $(\mathbf{r} \to \bar{\mathbf{s}} : [U]; G) \setminus \mathbf{p} \xrightarrow{U'} \bar{\mathbf{q}} \cong \mathbf{r} \to \bar{\mathbf{s}} : [U]; (G \setminus \mathbf{p} \xrightarrow{U'} \bar{\mathbf{q}})$   $if \{\mathbf{r}, \bar{\mathbf{s}}\} \cap \{\mathbf{p}, \bar{\mathbf{q}}\} = \emptyset \ and \{\mathbf{p}, \bar{\mathbf{q}}\} \subseteq G$   $(branching\ reduction)$   $\mathbf{p} \to \bar{\mathbf{q}} : \{l_i : G_i\}_{i \in I} \setminus \mathbf{p} \xrightarrow{l} \bar{\mathbf{q}} \cong G_i \qquad l = l_i$   $(pass\ branching\ reduction)$   $\mathbf{r} \to \bar{\mathbf{s}} : \{l_i : G_i\}_{i \in I} \setminus \mathbf{p} \xrightarrow{l} \bar{\mathbf{q}} \cong \mathbf{r} \to \bar{\mathbf{s}} : \{l_i : G_i \setminus \mathbf{p} \xrightarrow{l} \bar{\mathbf{q}}\}_{i \in I}$   $if \{\mathbf{r}, \bar{\mathbf{s}}\} \cap \{\mathbf{p}, \bar{\mathbf{q}}\} = \emptyset \ and \ \forall i \in I : \{\mathbf{p}, \bar{\mathbf{q}}\} \subset G_i$ 

Theorem 1 (Broadcast). If  $G \setminus p \xrightarrow{l} \bar{q} \cong G'$  then  $G \setminus p \xrightarrow{l} q_1 \setminus p \xrightarrow{l} q_2 \cdots \setminus p \xrightarrow{l} q_n = G'$  where  $n \in \mathbb{N}$  and  $\bar{q} = \{q_1, q_2, \dots, q_n\}$ .

*Proof.* By induction on n and G.

Example 4. We formalise a global type for UniProt query number 45 as follows:

```
\begin{split} I &= \{ \text{rhea}, \text{uniprot}, \text{wikidata} \} \\ G &= \text{local} \rightarrow \text{rhea} \{ l_i : \text{local} \rightarrow \text{uniprot} \{ l_i : \text{local} \rightarrow \text{wikidata} \{ l_i : G_i \} \} \}_{i \in I} \\ G_{\text{rhea}} &= \text{local} \rightarrow \text{rhea} : [U]; \text{uniprot} \rightarrow \text{rhea} : [U]; \\ & \text{wikidata} \rightarrow \text{rhea} : [U]; \text{end} \\ G_{\text{uniprot}} &= \text{rhea} \rightarrow \text{uniprot} : [U]; \text{local} \rightarrow \text{uniprot} : [U]; \\ & \text{wikidata} \rightarrow \text{uniprot} : [U]; \text{end} \\ G_{\text{wikidata}} &= \text{rhea} \rightarrow \text{wikidata} : [U]; \text{uniprot} \rightarrow \text{wikidata} : [U]; \\ & \text{local} \rightarrow \text{wikidata} : [U]; \text{end} \\ \end{split}
```

Below is a global type reduction for **local** by choosing label  $l_i = l$ :

$$G \setminus \mathtt{local} \xrightarrow{l} \{\mathtt{rhea}, \mathtt{uniprot}, \mathtt{wikidata}\} = G_i$$

Algorithm 1 translates a global type to a query template, following translation on Table 1. The algorithm has two inputs, the projection of global protocol  $G \upharpoonright p$  and target participant q where a query will be executed. Suppose we use a global type G in Example 4 to build a query template for uniprot. This global type G has three branches for different continuations:  $G_{\mathtt{rhea}}$ ,  $G_{\mathtt{uniprot}}$  and  $G_{\mathtt{wikidata}}$ . Initially, we set  $\mathtt{p} = \mathtt{uniprot}$  for  $G \upharpoonright p$  and participant  $\mathtt{q} = \mathtt{uniprot}$ .

```
global protocol FederatedQuery(role Local, role Rhea, role UniProt,role Wikidata){
2
        choice at Local{
            /* Local tells everyone that it chooses to act as Rhea */
3
            Rhea() from Local to Rhea;
            choice at Local{
                Rhea() from Local to UniProt;
                choice at Local{
                    Rhea() from Local to Wikidata;
                     /* Rhea */
                    Select(reaction) from Local to Rhea;
11
                    Select(protein, proteinFullName) from UniProt to Rhea;
                    Select(chemical,chemicalLabel,treatedLabel) from Wikidata to Rhea;
            }
15
        }
        or {
17
             /* Local tells everyone that it chooses to act as UniProt */
            UniProt() from Local to Rhea;
            choice at Local{
                UniProt() from Local to UniProt;
                choice at Local{
                    UniProt() from Local to Wikidata;
                     /* UniProt */
                    Select(reaction) from Rhea to UniProt;
                    Select(protein,proteinFullName) from Local to UniProt;
                    Select(chemical,chemicalLabel,treatedLabel) from Wikidata to UniProt;
            }
29
             /* Local tells everyone that it chooses to act as Wikidata */
31
            Wikidata() from Local to Rhea;
32
            choice at Local{
33
34
                Wikidata() from Local to UniProt;
35
                choice at Local{
                    Wikidata() from Local to Wikidata;
                     /* Wikidata */
37
                    Select(reaction) from Rhea to Wikidata;
                    Select(protein, proteinFullName) from UniProt to Wikidata;
39
                    Select(chemical,chemicalLabel,treatedLabel) from Local to Wikidata;
40
41
            }
42
43
        }
   }
44
```

Fig. 6: Scribble script of global type for UniProt query number 45

Next, global type G reduced by selecting a branch for uniprot,  $\setminus local \xrightarrow{1} \bar{s}$  where l = q and  $\bar{s} = \{rhea, uniprot, wikidata\}$ . Selecting label  $l_i = l$  continues with  $G_i$  shows the role of local which can either become rhea following with  $G_{rhea}$ , uniprot with  $G_{uniprot}$ , or wikidata with  $G_{wikidata}$ .

The Algorithm 1 at line number 2 evaluates  $G_i \upharpoonright p$  whether it is an empty (end) or continues to be translated. In the case of p = q, a message type in  $G_i \upharpoonright p = r?[U]$  and r is a local then translates a message type to a query Q. This query will be executed locally at p. On the other hand, the message type is translated to service federation  $S_p.Q$ , when p is neither local or current target participant q. In summary,  $G_{uniprot} \upharpoonright uniprot$  translates to a local query in uniprot and  $G_{uniprot} \upharpoonright rhea$  explains that uniprot sends and evaluates a query to rhea.

Table 1: Translation of local type and SPARQL relational algebra

Local type $(T_{q} = G \upharpoonright q)$		$\mathbf{SPARQL} \ \mathbf{algebra} \ (Q_q)$
$\llbracket  ext{end}  rbracket$	=	Ø
$[\![\mathbf{p}?[U];\!G\upharpoonright\mathbf{q}]\!]\mathbf{p}\neq Local$	=	$\mathcal{S}_p.\llbracket G \upharpoonright \mathtt{p} \rrbracket \wedge \llbracket G \upharpoonright \mathtt{q} \rrbracket$
$[\![\mathbf{p}?[U];\!G \upharpoonright \mathbf{q}]\!]  \mathbf{p} = Local$	=	$Q_{\mathtt{q}} \wedge \llbracket G \upharpoonright \mathtt{q} \rrbracket$
$\llbracket \mathtt{p}  !  [U]  ; G \upharpoonright \mathtt{q} \rrbracket$	=	$\llbracket G \upharpoonright \mathbf{q} \rrbracket$
$\llbracket \mathtt{p} \oplus \{l_i : G_i \restriction \mathtt{q}\}_{i \in I} \rrbracket$	=	$[\![G_i \restriction \mathtt{q}]\!]_{i \in I}$
$[\![\mathtt{p}\&\{l_i:G_i\upharpoonright\mathtt{q}\}_{i\in I}]\!]$	=	$[\![G_i \upharpoonright \mathbf{q}]\!]_{i \in I}$

Table 1 only considers a *message type* to be translated directly into a query. The **end** type is translated to nothing and represents the end of a query. However, *internal choice* and *external choice*, defined in Table 1, do not have a query translation. Instead, it continues to translate the following local types. Although it does not have query translation, it plays an essential part in the reduction process by deciding what is **local** participant role will be.

In a simple federation query where uniprot calls federation service to both rhea and wikidata. Here, rhea and wikidata send their result directly to uniprot and do not expect to receive a result from calling another federation service. Both local types  $T_{\rm rhea}$  and  $T_{\rm wikidata}$  define rhea![U] which does not translate to any queries. The algorithm continues to read recursively and reduces the local type from all participants until it is finished.

In a nested service federation, each local type for three participants, including rhea, uniprot and wikidata may have called a federation service to other participants. For example, wikidata expects a federation service result from uniprot,

## Algorithm 1 Construct SPARQL Query Template

```
1: function SQT(G \upharpoonright p, q)
                                                                                \triangleright begin with p = q where p, q \in pt(G) \setminus \{local\}
               while (G \setminus \mathbf{local} \xrightarrow{l} \bar{\mathbf{s}}) \upharpoonright \mathbf{p} \neq \mathbf{end}; l = \mathbf{q} \mathbf{do}
 2:
                                                                                                                                      \triangleright \bar{\mathbf{s}} = pt(G) \setminus \{ \mathbf{local} \}
                      if T_p = \mathbf{r}?[U] then
 3:
                                                                                                                                                \triangleright p \neq r; r \in pt(G)
 4:
                             if r = local then
 5:
                                     Q_{\mathsf{q}} \leftarrow \llbracket \mathbf{r}?[U] \rrbracket
                                                                                                                                                     \triangleright local query Q
                              else
 6:
                                     S_{\mathbf{r}}.(Q_{\mathbf{q}}) \leftarrow \mathrm{SQT}(G \upharpoonright \mathbf{r}, \mathbf{q})
                                                                                                                                     \triangleright federated query S.Q
 7:
                              end if
 8:
 9:
                      end if
10:
                       Q_{\mathbf{q}}' = Q_{\mathbf{q}} \wedge \mathcal{S}_{\mathbf{r}}.Q_{\mathbf{q}} \wedge \cdots \wedge \mathcal{S}_{\mathbf{r}'}.Q_{\mathbf{q}}
                                                                                                                                           ▷ Conjunctive query
               end while
11:
12:
               return Q'_{\mathbf{q}}
13: end function
```

 $T_{\text{wikidata}} = \text{uniprot}?[U]$ . Meanwhile, uniprot is waiting federation service result from rhea before it can be sent to wikidata,  $T_{\text{uniprot}} = \text{rhea}?[U]$ ; wikidata![U]. The SQT algorithm requires definitions from all participant's local types in order to generate a complete query template. The algorithm begins by generating a local query and service federation for target participant  $\mathbf{q}$  then calling a related local type to generate a query in federated service.

#### 5 Evaluation

We conduct experiments in the docker environment. We build a small-scale environment with three Apache Fuseki containers and a triple dataset to imitate Rhea, UniProt and Wikidata. For statistics rhea contains 2051 triples, uniprot 129902 triples and wikidata 6592 triples. We record the elapsed projection time, constructing SQT and performance differences between variants of federated query communication that follow the current use case.

Example 5. We formalise the general structure of a global protocol (type) for a current evaluation as follows:

$$G \setminus \mathsf{local} \xrightarrow{l} \bar{\mathsf{q}} = G' \qquad where \qquad l \in pt(G) \setminus \{\mathsf{local}\}$$

We prepare global type G following Example 5. We assign varying numbers of participants to global type G: 10, 30, and 60. Table 2 shows the elapsed time for constructing SQT. The projection column shows the time needed to generate all local types. It shows that increasing the number of participants will result in a longer elapsed time.

We prepared three global types following Example 5 for service federation performance. We define each global type to have three specifications for **rhea**, **uniprot** and **wikidata**. We have nine different test cases in total. Global type  $G_1$  calls two remote service federations from one participant, following Example 4. However, global types  $G_2$  and  $G_3$  call nested service federations. Global type  $G_2$  is given in Example 6.

Example 6. Based on the global type in Example 5, we define  $G_{\tt uniprot}$  such that uniprot can only call rhea service federation through wikidata. The complete

	Time (second)		
Number of participants in ${\cal G}$	Projection (total)	$\begin{array}{c} \mathbf{SQT} \\ \mathrm{(average)} \end{array}$	
10 participants	0.445	0.321	
30 participants	2.720	0.724	
60 participants	30.624	1.429	

Table 2: Construction time for single query

continuation of global type  $G_i$  for nested service federation defined as follows:

```
\begin{split} I &= \{ \text{rhea}, \text{uniprot}, \text{wikidata} \} \\ G_{\text{rhea}} &= \text{local} \rightarrow \text{rhea} : [U]; \text{uniprot} \rightarrow \text{rhea} : [U]; \\ &\quad \text{wikidata} \rightarrow \text{uniprot} : [U]; \text{end} \\ G_{\text{uniprot}} &= \text{rhea} \rightarrow \text{wikidata} : [U]; \text{wikidata} \rightarrow \text{uniprot} : [U]; \\ &\quad \text{local} \rightarrow \text{uniprot} : [U]; \text{wikidata} \rightarrow \text{uniprot} : [U]; \text{end} \\ G_{\text{wikidata}} &= \text{rhea} \rightarrow \text{wikidata} : [U]; \text{uniprot} \rightarrow \text{rhea} : [U]; \\ &\quad \text{local} \rightarrow \text{wikidata} : [U]; \text{end} \end{split}
```

We define a simplified notation in Table 3, 1 for local,  $\mathbf{r}$  for rhea,  $\mathbf{u}$  for uniprot and  $\mathbf{w}$  for wikidata. We show federated query elapsed time with different communication sequences. Suppose we take the first case in Table 3 which is generating a query template for rhea,  $Q'_{\mathbf{r}} = Q_{\mathbf{r}} \wedge \mathcal{S}_{\mathbf{u}}.Q_{\mathbf{r}} \wedge \mathcal{S}_{\mathbf{w}}.Q_{\mathbf{r}}$ . Based on Algorithm 1 and an input data  $[(G_1 \setminus \mathbf{l} \xrightarrow{\mathbf{r}} \mathbf{r}, \mathbf{u}, \mathbf{w}) \mid \mathbf{r}]$ , global type  $G_1$  is reduced by telling every participant that local will acts as rhea under reduction of  $G_1 \setminus \mathbf{local} \xrightarrow{\mathbf{rhea}} \{\mathbf{rhea}, \mathbf{uniprot}, \mathbf{wikidata}\}$ . This syntactically will produce  $G_{\mathbf{rhea}}$ . Global type is projected to rhea,  $G_{\mathbf{rhea}} \mid \mathbf{rhea} = T_{\mathbf{rhea}}$ , before being translated into a query with Table 1.

The first query template in Table 3 has an overhead communication exchange between participants, as shown in Fig. 7a and local type definitions. Based on the query execution sequence in Fig. 4, a result from rhea must join with uniprot to retrieve reactions and related human enzymes. Next, a result must join with wikidata to find interactions between those previous enzymes and drug descriptions. Ideally, uniprot sends the join result directly to wikidata but local type  $T_{\rm u} = {\bf r}![U]$ ; end defines a communication that uniprot can send only to rhea. The communication uniprot to wikidata passes through rhea first and contin-

Table 3: Query elapsed time from different global protocol

Query Template	$\begin{array}{c} \textbf{Elapsed time} \\ \text{(second)} \end{array}$
$1. \ \llbracket (G_1 \setminus 1 \overset{\mathtt{r}}{\to} \mathtt{r}, \mathtt{u}, \mathtt{w}) \upharpoonright \mathtt{r} \rrbracket = Q_\mathtt{r} \wedge \mathcal{S}_\mathtt{u}.Q_\mathtt{r} \wedge \mathcal{S}_\mathtt{w}.Q_\mathtt{r}$	23.160
$2. \; [\![ (G_1 \setminus 1 \overset{\mathtt{u}}{\to} \mathbf{r}, \mathtt{u}, \mathtt{w}) \upharpoonright \mathtt{u}]\!] = \mathcal{S}_\mathtt{r}.Q_\mathtt{u} \wedge Q_\mathtt{u} \wedge \mathcal{S}_\mathtt{w}.Q_\mathtt{u}$	12.255
$3. \ \llbracket (G_1 \setminus 1 \overset{w}{\to} \mathbf{r}, \mathbf{u}, \mathbf{w}) \upharpoonright \mathbf{w} \rrbracket = \mathcal{S}_{\mathtt{r}}.Q_{\mathtt{w}} \wedge \mathcal{S}_{\mathtt{u}}.Q_{\mathtt{w}} \wedge Q_{\mathtt{w}}$	11.334
4. $\llbracket (G_2 \setminus 1 \xrightarrow{\mathbf{r}} \mathbf{r}, \mathbf{u}, \mathbf{w}) \upharpoonright \mathbf{r} \rrbracket = Q_{\mathbf{r}} \wedge \mathcal{S}_{\mathbf{u}}(Q_{\mathbf{r}} \wedge \mathcal{S}_{\mathbf{w}}.Q_{\mathbf{r}})$	24.500
5. $[(G_2 \setminus 1 \stackrel{\mathrm{u}}{\to} \mathbf{r}, \mathbf{u}, \mathbf{w}) \upharpoonright \mathbf{u}] = \mathcal{S}_{\mathbf{w}}(\mathcal{S}_{\mathbf{r}}.Q_{\mathbf{u}}) \wedge Q_{\mathbf{u}} \wedge \mathcal{S}_{\mathbf{w}}.Q_{\mathbf{u}}$	14.824
6. $[(G_2 \setminus 1 \stackrel{w}{\to} r, u, w) \upharpoonright w] = \mathcal{S}_{r}(Q_{w} \wedge \mathcal{S}_{u}.Q_{w}) \wedge Q_{w}$	13.076
7. $[(G_3 \setminus 1 \xrightarrow{\mathtt{r}} \mathtt{r}, \mathtt{u}, \mathtt{w}) \upharpoonright \mathtt{r}] = Q_{\mathtt{r}} \wedge \mathcal{S}_{\mathtt{w}}(\mathcal{S}_{\mathtt{u}}.Q_{\mathtt{r}} \wedge Q_{\mathtt{r}})$	23.084
8. $[(G_3 \setminus 1 \stackrel{\mathrm{u}}{\to} r, \mathbf{u}, \mathbf{w}) \upharpoonright \mathbf{u}] = \mathcal{S}_r.Q_\mathbf{u} \wedge Q_\mathbf{u} \wedge \mathcal{S}_r(\mathcal{S}_\mathbf{w}.Q_\mathbf{u})$	19.786
9. $[(G_3 \setminus 1 \stackrel{w}{\to} \mathbf{r}, \mathbf{u}, w) \upharpoonright w] = \mathcal{S}_{u}(\mathcal{S}_{r}.Q_{w} \wedge Q_{w}) \wedge Q_{w}$	4.241

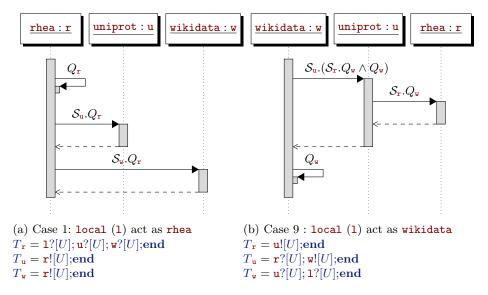


Fig. 7: Federated service implementation between two global protocols

ues to wikidata together with federated query  $\mathcal{S}_{\mathtt{w}}.Q_{\mathtt{r}}$ . Finally, wikidata sends result back to rhea. This causes a longer execution time because uniprot cannot send directly to wikidata and must pass rhea first.

In contrast, case number 9 makes the most efficient communication as shown in Fig. 7b, as the join result is sent directly to the next target participant without an intermediary. According to local type  $T_{\mathbf{r}} = \mathbf{u}![U]$ ; end, rhea sends directly to uniprot. Next, uniprot sends a query result to wikidata as a final destination,  $T_{\mathbf{u}} = \mathbf{r}?[U]; \mathbf{w}![U]$ ; end.

## 6 Conclusion

The current SQT (SPARQL Query Template) algorithm is a convenient and faster way of generating queries than writing them manually. The use of global types helps identify RDF sources by checking the interaction between participants. Global types ensure that executing queries on all projections will provide a complete result set. Moreover, the communication sequence described in global types can also be used to check for any overhead communication during a federated query. These benefits can significantly reduce network costs and ultimately make federated queries faster. In addition, we introduce a broadcast reduction for global types and prove its soundness against the original semantics of global types.

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