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ISSN 0103-9741

Monografia em Ciência da Computação nº 01/11

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PONTIFÍCIA UNIVERSIDADE CATÓLICA DO RIO DE JANEIRO RUA MARQUÊS DE SÃO VICENTE, 225 - CEP 22451-900 RIO DE JANEIRO Monografias em Ciência da Computação, No. 01/11 Editor: Prof. Carlos José Pereira de Lucena ISSN: 0103-9741 April, 2011

# The Role of Constraints in Linked Data

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**Abstract.** This paper investigates the role that constraints play in Linked Data in the context of a multi-step modeling process, involving three ontologies. The source ontology provides a local model of the exported data. The domain ontology provides a conceptual model of the application domain. The application ontology describes the external model of the exported data, using a subset of the vocabulary of the domain ontology. The main contributions of the paper are methods for constructing application ontology constraints and for defining the mappings between the three ontologies. The methods assume that the ontologies are written in an expressive family of languages and depend on a procedure to test logical implication, which explores the structure of sets of constraints.

Keywords: constraints, Linked Data, mediated schema.

**Resumo**. Este trabalho investiga o papel de restrições de integridade em *Linked Data*, no contexto de um processo de modelagem envolvendo ontologias em três níveis. A ontologia da fonte de dados oferece um modelo local para os dados exportados. A ontologia de domínio provê um modelo conceitual do domínio de aplicação. A ontologia de aplicação descreve os dados exportados usando um subconjunto do vocabulário da ontologia de domínio. A principal contribuição do trabalho consiste em métodos para construção das restrições de integridade da ontologia de aplicação e para definir os mapeamentos entre as três ontologias. Os métodos assumem que as ontologias estão escritas em uma família de linguagens com poder de expressividade adequado e dependem de um procedimento para testar implicação lógica que explora a estrutura do conjunto de restrições.

Palavras-chave: restrições de integridade, Linked Data, esquema mediado.

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# 1 Introduction

The term *Linked Data* refers to a set of best practices for publishing and connecting structured data on the Web [3]. A Linked Data source may publish a local model of the exported data. A *model* is expressed as a *vocabulary*, that is, a collection of classes and properties, expressed in RDF, using terms from RDFS and OWL. The Linked Data source may also publish a mapping between its local vocabulary and a *reference* vocabulary (or several such vocabularies). A *mapping* may be expressed as a set of RDF triples that link classes and properties in one vocabulary to those in another, or it may be defined using a schema mapping language.

We investigate in this paper the role that constraints play in Linked Data. The motivation lies in that a Linked Data source should publish its local vocabulary together with a set of local constraints that capture the semantics of the local classes and properties. If the Linked Data source publishes a mapping between its local vocabulary and a reference vocabulary, then we have to specify the local constraints so that they are somehow consistent with those of the reference classes and properties.

More precisely, an *ontology* is a pair  $O = (V_O, C_O)$ , where  $V_O$  is a vocabulary and  $C_O$  is a set of constraints over  $V_O$ . A *mapping* from a *source* ontology  $S = (V_S, C_S)$  into a *target* ontology  $T = (V_T, C_T)$  is a set of definitions of the form  $D \equiv e$ , where D is a class (or property) in  $V_T$  and e is a class definition (or a property definition) that uses symbols in  $V_S$ . The *identity mapping* maps a symbol into itself (the symbol must therefore occur in both  $V_S$  and  $V_T$ ). We do not require that a mapping provides definitions for all symbols in  $V_T$ .

To better formulate the local constraint specification problem, we introduce a multi-step process to model Linked Data. Briefly, the process goes as follows. First create a *source ontology*  $S = (V_S, C_S)$ , which models the data to be published. Then select a *domain ontology*  $D = (V_D, C_D)$ , which models the application domain. In fact, D may be a combination of ontologies covering distinct domains. Proceed by creating *a source-to-domain* mapping  $\gamma$  from S into D. Note that  $\gamma$  may not have definitions for all symbols in  $V_D$ . Let  $V_A$  be the subset of  $V_D$  such that D is in  $V_A$  iff  $\gamma$  has a definition of the form  $D \equiv e$ . Create a set of constraints  $C_A$  that model the semantics of the classes and properties in  $V_A$ . That is, create an *application ontology*  $A=(V_A, C_A)$ . We reinterpret  $\gamma$  as *a source-to-application* mapping  $\gamma_{SA}$  from S into A and introduce an *application-to-domain* identity mapping  $\gamma_{AD}$  from A into D that associates each symbol in  $V_A$  into itself (this is possible since  $V_A$  is a subset of  $V_D$ ). The problem is how to create  $C_A$  and decide what properties  $A = (V_A, C_A)$ ,  $\gamma_{SA}$  and  $\gamma_{AD}$  should have.

Suppose first that we require that the data exported through  $\gamma_{SA}$  satisfies  $C_A$ , and that  $C_A$  contains all constraints that can be derived from  $C_D$  and that use only symbols in  $V_A$ . In this case, we say that the application ontology is an *open fragment* of the domain ontology. The last step of the process is then to create  $C_A$  and perhaps adjust  $\gamma_{SA}$  so that these requirements are met. Sections 3.1 and 4 formulate these requirements in detail and describe methods to support this step.

Suppose now that we require that the data exported through  $\gamma_{SA}$  satisfies  $C_D$ , when all classes and properties in  $V_D$ , but not in  $V_A$ , are taken as the empty set (when the source data is published). In this case, we say that the application ontology is a *closed fragment* of the domain ontology. The

last step of the process now is to adjust  $V_A$  and  $\gamma_{SA}$  so that this requirement is met. Sections 3.2 and 4 formulate these requirements in detail and describe methods to support this step.

These requirements are justified since, if A is a closed fragment of D, then any Web application that processes data modeled according to D will also be able to process data published by the data source. Furthermore, if A is an open fragment of D, then any Web application that processes data modeled according to D and *that uses only the classes and properties in the vocabulary of* A will also be able to process the data published by the data source.

The main contributions of the paper are methods for constructing application ontology constraints and for adjusting the definition of the mappings, when the application ontology is an open or a closed fragment of the domain ontology. The methods assume that the ontologies are written in an expressive family of attributive languages and depend on a procedure to test logical implication, which explores the structure of sets of constraints, captured as a *constraint graph* [5].

The results reported in the paper cover a topic – the role that constraints play in Linked Data – that is much neglected in the literature. The question of Linked Data semantics is not new, though. Recent investigation [7,8,12] in fact questions the correct use of owl:sameAs to inter-link datasets.

They contribute to the discussion on the triplication of relational databases [6]. Indeed, triplification tools (see [17] for a list) typically do not consider constraints.

The results in this paper also contribute to improving ontology browsing tools based on the idea of *focus+context* [16], where the notion of focus would be carried out by a vocabulary selection and the notion of context would be provided by the constraints. The methods to construct fragments of the domain ontology would act as a lens through which the user would browse the (large) domain ontology. The notions of open and closed ontology fragments are akin to the classification of the mappings between the local sources and the mediated schema into sound, exact or complete [9]. The three-step process adopted in the paper is similar to that proposed in [13,15]. We reported a preliminary investigation on the generation of application ontologies in [13], but without using constraint graphs.

The paper is organized as follows. Section 2 presents the formal framework adopted in the paper. Section 3 focuses on how to construct the constraints of the application ontology. Section 4 discusses how to adjust the mapping from the source ontology into the application ontology. Finally, Section 5 contains the conclusions.

# 2 A Formal Framework

#### 2.1 A Brief Review of Attributive Languages

We adopt a family of *attributive languages* [1] defined as follows. A *language*  $\mathcal{L}$  in the family is characterized by an *alphabet* A, consisting of a set of *atomic concepts*, a set of *atomic roles*, the *universal concept*  $\top$  and the *bottom concept*  $\bot$ . The set of *role descriptions* and the set of *concept descriptions* of  $\mathcal{L}$  (or in A) are defined as follows:

• An atomic concept, and the universal and bottom concepts are concept descriptions, and an atomic role is a role description

• If e and f are concept descriptions and p is a role description, then  $\neg e$  (*negation*),  $e \sqcup f$  (*union*), and ( $\ge n p$ ) (*at-least restriction*) are concept descriptions, and  $p^-$  (*inverse*) is a role description.

An *interpretation* s for A consists of a nonempty set  $\Delta^s$ , the *domain* of s, whose elements are called *individuals*, and an *interpretation function*, also denoted s, where:

- $s(\perp) = \emptyset$  and  $s(\top) = \Delta^s$
- $s(A) \subseteq \Delta^s$ , for each atomic concept A of A
- $s(P) \subseteq \Delta^s \times \Delta^s$ , for each atomic role *P* of *A*

The function *s* is extended to role and concept descriptions of L as follows:

- $s(\neg e) = \Delta^s s(e)$  (the complement of s(e) w.r.t.  $\Delta^s$ )
- $s(e \sqcup f) = s(e) \cup s(f)$  (the union of s(e) and s(f))
- $s(\geq n p) = \{I \in \Delta^s / |\{J \in \Delta^s / (I,J) \in s(p)\}| \geq n\}$

(the set of individuals that s(p) relates to at least n distinct individuals)

•  $s(p^{-}) = s(p)^{-}$  (the inverse of s(p))

A *formula* of  $\mathcal{L}$  (or in A) is an expression of the form  $u \sqsubseteq v$ , called an *inclusion*, or of the form  $u \equiv v$ , called an *equivalence*, where u and v are both concept descriptions or they are both role descriptions of  $\mathcal{L}$ . A *definition* is an equivalence of the form  $D \equiv e$ , where D is an atomic concept and e is a concept description, or D is an atomic role and e is a role description.

Let s be an interpretation for A,  $\sigma$  be a formula and  $\Sigma$  and  $\Gamma$  be sets of formulas of  $\mathcal{L}$ . We say that

- *s* satisfies  $u \sqsubseteq v$  iff  $s(u) \subseteq s(v)$ , and *s* satisfies  $u \equiv v$  iff s(u) = s(v)
- *s* is a *model* of  $\sigma$ , denoted  $s \vDash \sigma$ , iff s satisfies  $\sigma$
- *s* is a *model* of  $\Sigma$ , denoted  $s \models \Sigma$ , iff *s* satisfies all formulas in  $\Sigma$
- $\Sigma$  logically implies  $\sigma$ , denoted  $\Sigma \vDash \sigma$ , iff any model of  $\Sigma$  satisfies  $\sigma$
- $\Sigma$  logically implies  $\Gamma$ , denoted  $\Sigma \vDash \Gamma$ , iff any model of  $\Sigma$  is also a model of  $\Gamma$
- $\Sigma$  is tautologically equivalent to  $\Gamma$  iff  $\Sigma$  logically implies  $\Gamma$ , and vice-versa

If **B** is a subset of **A**, then  $\Sigma/B$  denotes the set of formulas  $\sigma$  using only symbols in **B** such that  $\Sigma$  logically implies  $\sigma$ .

Finally, we use the following abbreviations: " $e \sqcap f$ " for " $\neg(\neg e \sqcup \neg f)$ " (*intersection*), " $\exists p$ " for " $(\geq 1 p)$ " (*existential quantification*), " $(\leq n p)$ " for " $\neg(\geq n+1 p)$ " (*at-most restriction*) and " $u \mid v$ " for " $u \sqsubseteq \neg v$ " (*disjunction*).

#### 2.2 Extralite Ontologies and Ontology Mappings

We will work with extralite ontologies [5] that partially correspond to OWL Lite.

**Definition 1**: An *extralite ontology* is a pair  $O = (V_O, C_O)$  such that

- (i)  $V_O$  is a finite alphabet, called the *vocabulary* of *O*, whose atomic concepts and atomic roles are called the *classes* and *properties* of *O*, respectively.
- (ii)  $C_0$  is a set of formulas in  $V_0$ , called the *constraints* of O, which must be of one the forms
  - *Domain Constraint:*  $\exists P \sqsubseteq D$  (property *P* has class *D* as domain)

- *Range Constraint:*  $\exists P^- \sqsubseteq R$  (property *P* has class *R* as range)
- *minCardinality Constraint:*  $C \sqsubseteq (\ge k P)$  or  $C \sqsubseteq (\ge k P^{-})$

(property P or its inverse  $P^-$  maps each individual in class C to at least k distinct individuals)

• *maxCardinality Constraint:*  $C \sqsubseteq (\leq k P)$  or  $C \sqsubseteq (\leq k P^{-})$ 

(property P or its inverse  $P^-$  maps each individual in class C to at most k distinct individuals)

- Subset Constraint:  $E \sqsubseteq F$  (class E is a subclass of class F)
- *Disjointness Constraint:*  $E \mid F$  (classes *E* and *F* are disjoint).  $\Box$

We will sometimes associate a *prefix*, such as "o:", to the alphabet  $V_0$  and indicate that a symbol T occurs in  $V_0$  by writing "o:T". We *normalize* a constraint by eliminating any abbreviated form used. For example, " $\exists P \sqsubseteq D$ " is normalized as " $(\geq 1 P) \sqsubseteq D$ " and " $C \mid D$ " as " $C \sqsubseteq \neg D$ ". A *constraint expression* is an expression that may occur on the right- or left-hand sides of a normalized constraint.

A mapping from a source ontology  $S = (V_S, C_S)$  into a target ontology  $\mathcal{T} = (V_T, C_T)$  is a set  $\gamma_{ST}$  of definitions of the form  $D \equiv e$  where D is an atomic concept (or atomic role) in  $V_T$  and eu is a concept description (or a role description) in  $V_S$  such that no two definitions in  $\gamma_{ST}$  have the same symbol on the left-hand side. Note that we do not require that  $\gamma_{ST}$  has a definition for each symbol in  $V_T$ . Finally,  $\gamma_{ST}$  induces a function  $\hat{\gamma}_{ST}$  from interpretations for  $V_S$  into interpretations for  $V_T$ , as defined in [5].

#### 2.3 Constraint Graphs

In this section, we introduce the notion of concept graphs, which captures the structure of sets of constraints and is essential to the constraint construction methods of Section 3 and to the mapping redefinition method of Section 4.

We say that the *complement* of a non-negated expression e is  $\neg e$ , and vice-versa; the *complement* of  $\bot$  is  $\neg$ , and vice-versa. If c is an expression, then  $\overline{c}$  denotes of complement of c.

Let  $\Sigma$  be a set of normalized constraints and  $\Omega$  be a set of constraint expressions.

- **Definition 2**: The labeled graph  $g(\Sigma, \Omega) = (\gamma, \delta, \kappa)$  that *captures*  $\Sigma$  and  $\Omega$ , where  $\kappa$  labels each node with an expression, is defined as follows:
  - (i) For each concept expression *e* that occurs on the right- or left-hand side of an inclusion in  $\Sigma$ , or that occurs in  $\Omega$ , there is exactly one node in  $\gamma$  labeled with *e*. If necessary, the set of nodes is augmented with new nodes so that:
    - (a) For each atomic concept C, there is one node in  $\gamma$  labeled with C.
    - (b) For each atomic role P, there is one node in γ labeled with (≥1 P) and one node labeled with (≥1 P<sup>-</sup>).
  - (ii) If there is a node in  $\gamma$  labeled with a concept expression *e*, then there must be exactly one node in  $\gamma$  labeled with  $\overline{e}$ .
  - (iii) For each inclusion  $e \sqsubseteq f$  in  $\Sigma$ , there is an arc (M,N) in  $\delta$ , where M and N are the nodes labeled with e and f, respectively.

- (iv) If there are nodes *M* and *N* in  $\gamma$  labeled with  $(\geq m p)$  and  $(\geq n p)$ , where *p* is either *P* or *P*<sup>-</sup> and *m*<*n*, then there is an arc (*N*,*M*) in  $\delta$ .
- (v) If there is an arc (M,N) in  $\delta$ , where M and N are the nodes labeled with e and f respectively, then there is an arc (K,L) in  $\delta$ , where K and L are the nodes labeled with  $\overline{f}$  and  $\overline{e}$ , respectively.
- (vi) These are the only nodes and arcs of  $g(\Sigma)$ .  $\Box$
- **Definition 3**: The labeled graph  $G(\Sigma, \Omega) = (\eta, \varepsilon, \lambda)$  that *represents*  $\Sigma$  and  $\Omega$ , where  $\lambda$  labels each node with a set of expressions, is defined from  $g(\Sigma, \Omega)$  by collapsing each clique of  $g(\Sigma, \Omega)$  into a single node labeled with the expressions that previously labeled the nodes in the clique. When  $\Omega$  is the empty set, we simply write  $G(\Sigma)$  and say that the graph *represents*  $\Sigma$ .  $\Box$

If a node *K* of  $G(\Sigma, \Omega)$  is labeled with an expression *e*, then  $\overline{K}$  denotes the node labeled with  $\overline{e}$  (which may be *K* itself). We use  $K \rightarrow M$  to indicate that there is a path in  $G(\Sigma, \Omega)$  from *K* to *M*.

- **Definition 4**: Let  $G(\Sigma, \Omega) = (\eta, \varepsilon, \lambda)$  be the labeled graph that represents  $\Sigma$  and  $\Omega$ . We say that a node *K* of  $G(\Sigma, \Omega)$  is a  $\perp$ -*node with level n*, for a non-negative integer *n*, iff one of the following conditions holds:
  - (i) *K* is is a  $\perp$ -node with level 0 iff
    - a. *K* is labeled with  $\perp$ , or
    - b. there are nodes *M* and *N*, not necessarily distinct from *K*, and a non-negated concept expression *h* such that *M* and *N* are labeled with *h* and  $\neg h$ , and  $K \rightarrow M$  and  $K \rightarrow N$ .
  - (ii) *K* is is a  $\perp$ -node with level n+1 iff
    - a. There is a  $\perp$ -node *M* of level *n*, distinct from *K*, such that  $K \rightarrow M$ , and *M* is the  $\perp$ -node with the smallest level such that  $K \rightarrow M$ , or
    - b. *K* is labeled with a minCardinality constraint of the form  $(\geq 1 P)$  (or of the form  $(\geq 1 P^{-})$ ) and there is a  $\perp$ -node *M* of level *n*, distinct from *K*, such that *M* is labeled with  $(\geq 1 P^{-})$  (or with  $(\geq 1 P)$ ), and *M* is the  $\perp$ -node with the smallest level labeled with  $(\geq 1 P^{-})$  or  $(\geq 1 P)$ .  $\Box$
- **Definition 5:** Let  $G(\Sigma, \Omega) = (\eta, \varepsilon, \lambda)$  be the labeled graph that represents  $\Sigma$  and  $\Omega$ . Let K be a node of  $G(\Sigma, \Omega)$ . We say that K is a  $\perp$ -node iff K is a  $\perp$ -node with level n, for some non-negative integer n. We also say that K is a  $\top$ -node iff  $\overline{K}$  is a  $\perp$ -node.  $\Box$

Based on constraint graphs, we introduce a procedure to test logical implication for extralite ontologies, whose soundness and completeness is established in [5]:

```
IMPLIES(\Sigma, e \equiv f)

input: a set \Sigma of normalized constraints and a normalized constraint e \equiv f

output: "YES - \Sigma logically implies e \equiv f"

"NO - \Sigma does not logically imply e \equiv f"

begin Construct G(\Sigma, \{e, f\}), the representation graph for \Sigma and \{e, f\};

if the node of G(\Sigma, \{e, f\}) labeled with e is a \bot-node, or

the node of G(\Sigma, \{e, f\}) labeled with f is a \top-node, or

there is a path in G(\Sigma, \{e, f\}) from the node labeled with e to the node la-

beled with f,

then return "YES - \Sigma logically implies e \equiv f";

else return "NO - \Sigma does not logically imply e \equiv f";

end
```

# 2.4 A Simple Example

The following example illustrates the concepts introduced thus far.

**Example 1:** Figure 1(a) shows the ER diagram of ontology  $PC = (V_{PC}, C_{PC})$  (a fragment of a model for a phone company). Figure 1(b) formalizes the set of constraints  $C_{PC}$ . The first column shows the domain and range constraints; for example, placedBy is an atomic role modeling a binary relationship from Call to Phone. The second column depicts the cardinality constraints; for example, number has maxCardinality equal to 1 w.r.t. Phone. The third column contains the subset and disjointness constraints; for example, MobilePhone and FixedPhone are disjoint. (For simplicity, we ignore data types, such as String, which would be treated as classes). Figure 2 depicts the graph  $G(C_{PC})$  that represents  $C_{PC}$  (using normalized constraints).  $\Box$ 



Fig. 1(a). ER diagram of PC (without cardinalities).

<pre>(≥1 number) ⊑ Phone (≥1 duration) ⊑ Call (≥1 placedBy) ⊑ Call (≥1 placedBy) ⊑ Phone (≥1 mobPlacedBy) ⊑ MobileCall</pre>	Call⊑ ¬(≥2 duration) Phone⊑ ¬(≥2 number)	FixedPhone ⊑ Phone MobilePhone ⊑ Phone RadioPhone ⊑ MobilePhone MobilePhone ⊑ ¬FixedPhone MobileCall ⊑ Call
(≥1 mobPlacedBy) ⊑ MobilePhone		

Fig. 1(b). Constraints of PC, after normalization.



Fig. 2. The graph  $G(C_{PC})$  representing the constraints of **PC**, after normalization.

# 3.1 Application Ontology as an Open Fragment of the Domain Ontology

The design of the application ontology  $\mathcal{A}$  and definition of the mappings depend on what requirements they must satisfy, discussed in detail in this and the next sections.

Recall that  $\gamma_{SA}$  induces a function  $\hat{\gamma}_{SA}$  from interpretations for  $V_S$  into interpretations for  $V_A$ . Also recall that  $C_D/V_A$  denotes the set of formulas  $\sigma$  using only symbols in  $V_A$  such that  $C_D$  logically implies  $\sigma$ . Consider the following set of requirements:

R0.  $V_A$  is a subset of  $V_D$ 

- R1.  $C_A$  is tautologically equivalent to  $C_D/V_A$
- R2. For any model *s* of  $C_S$ ,  $\hat{\gamma}_{SA}(s)$  is a model of  $C_A$

An application ontology  $\mathcal{A}$  that satisfies R0 and R1 is called an *open fragment* of  $\mathcal{D}$ . Requirement R0 guarantees that the data is exported in a subset of the vocabulary of the domain ontology. Requirements R1 and R2 indicate that the data published by the data source through  $\gamma_{SA}$  will be consistent with all constraints that can be derived from  $C_D$  and that use only symbols in  $V_A$ . Intuitively, Requirements R0, R1 and R2 imply that any Web application that processes data modeled according to  $\mathcal{D}$  and *that uses only the classes and properties in*  $V_A$  will also be able to process the data published by the data source through  $\gamma_{SA}$ .

Assume that the designer has already created  $V_A$  by selecting symbols from  $V_D$  so that R0 is trivially satisfied. The procedure **OpenFragment** generates  $C_A$  so that R1 is satisfied, based on the representation graph of  $C_D$  and on the vocabulary  $V_A$ :

**OpenFragment** $(C_D, V_A; C_A)$ the set  $C_D$  of normalized constraints of the domain ontology input: the vocabulary  $V_A$  of the application ontology output: the set  $C_A$  of normalized constraints of the application ontology **begin** Initialize  $C_A = \emptyset$ ; Construct  $G(C_D)$ , the representation graph for  $C_D$ ; Mark all nodes of  $G(C_D)$  labeled with expressions that use only atomic concepts and atomic roles in  $V_A$ ; for each pair of nodes M and N of  $G(C_D)$ M and N are marked and there is a path from M to N in  $G(C_D)$ if **then add**  $e \sqsubseteq f$  to  $C_A$  where e and f are expressions that label nodes M and N, respectively, and e and f are expression of  $V_A$ , and  $e \sqsubseteq f$  is an allowed constraint (in the sense of Section 2.), and  $\overline{f} \sqsubseteq \overline{e}$  is not already in  $C_A$  /\* to avoid redundant constraints \*/ return  $C_A$ ;

end

We note that **OpenFragment** is non-deterministic since the set of constraints generated depends on the order that the for-loop selects pairs of nodes of  $G(C_D)$ , which is not unique. The correctness of **OpenFragment** follows from the correctness of **IMPLIES**, introduced at the end of Section 2.3.

We will discuss how to adjust the source-to-application mapping to guarantee R2 in Section 4.

**Example 2**: Assume that the domain ontology is  $PC = (V_{PC}, C_{PC})$ , introduced in Example 1, and that the designer wants to define an application ontology, called *LPC* (for local phone company). He starts by manually defining the vocabulary  $V_{LPC}$  by selecting symbols from  $V_{PC}$ . Assume that  $V_{LPC}$  is:

(1)  $V_{LPC} = \{ FixedPhone, RadioPhone, Number, MobileCall, mobPlacedBy \}$ 

Then, procedure **OpenFragment** generates the constraints *C*<sub>LPC</sub> for *LPC*:

- (2)  $(\geq 1 \mod \text{PlacedBy}) \sqsubseteq \mod \text{MobileCall}$
- (3) FixedPhone  $\sqsubseteq \neg (\ge 2 \text{ number})$
- (4) RadioPhone  $\sqsubseteq \neg (\ge 2 \text{ number})$
- (5) RadioPhone  $\Box \neg$ FixedPhone

Recall that Figure 2 shows  $G(C_{PC})$ , the representation graph for  $C_{PC}$ . To help follow this example, the thicker boxes in Figure 2 indicate the marked nodes (that contain expressions in  $V_{LPC}$ ) and the thicker lines indicate the paths between marked nodes. Note that there is a path from Fixed-Phone to  $\neg(\ge 2 \text{ number})$ , which implies that (3) is a logical consequence of  $C_{PC}$ . The other constraints follow likewise.

Therefore, constraints (2) to (5) use only symbols in  $V_{LPC}$  and they are logical consequences of  $C_{PC}$  (albeit not necessarily in  $C_{PC}$ ). In fact, they meet Requirement R1. But, for example, **Open-Fragment** will not output

- (6) FixedPhone  $\sqsubseteq$  ( $\ge 1$  number)
- (7) ( $\geq 1 \mod \text{PlacedBy}$ )  $\equiv \neg (\geq 2 \pmod )$
- (8) FixedPhone  $\sqsubseteq \neg$ RadioPhone

The procedure does not output (6) since there is no path  $G(C_{PC})$  from FixedPhone to ( $\geq 1$  number), that is, (6) is not a logical consequence of  $C_{PC}$ . It does not output (7) since it is not an allowed constraint. Finally, it does not output (8) because (5) is already in  $C_{LPC}$ . However, since **Open-Fragment** is non-deterministic, it could have returned (8) instead of (5).  $\Box$ 

#### 3.2 Application Ontology as a Closed Fragment of the Domain Ontology

Let  $C_A^+$  be the set of constraints  $C_A$  extended with new constraints of the form  $C \equiv \bot$  (or  $P \equiv \bot$ ) that force each class *C* (or property *P*) in  $V_D$ , but not in  $V_A$ , to be the empty set. We now consider a different set of requirements:

R0.  $V_A$  is a subset of  $V_D$ 

R1'.  $C_A^+$  logically implies  $C_D$ 

R2. For any model *s* of  $C_S$ ,  $\hat{\gamma}_{SA}(s)$  is a model of  $C_A$ 

An application ontology  $\mathcal{A}$  that satisfies R0 and R1' is called a *closed fragment* of  $\mathcal{D}$ . Requirement R0 again guarantees that the data is exported in a subset of the vocabulary of the domain ontology. Requirements R1' and R2 indicate that the data published by the data source through  $\gamma_{SA}$  satisfies  $C_D$ , when each class C (or property P) in  $V_D$ , but not in  $V_A$ , is taken to be the empty set. Note that R1' then implies that the data published by the data source through  $\gamma_{SA}$  can always be extended to a consistent state of  $\mathcal{D}$ . Intuitively, Requirements R0, R1' and R2 imply that any Web application that processes data modeled according to  $\mathcal{D}$  will also be able to process data published by the data source through  $\gamma_{SA}$ , is taken to be the empty set.

Assume that the designer has already created  $V_A$  by selecting symbols from  $V_D$  so that R0 is trivially satisfied. In this section, we introduce a procedure, **ClosedFragment**, to extend  $V_A$  and  $\gamma_{SA}$  and to create  $C_A$  so that R1' is satisfied. Again, we will discuss how to adjust the source-to-application mapping to guarantee R2 in Section 4.

Contrasting with the result in Section 3.1, the second method may fail, if atomic roles must be included in  $V_A$ .

The procedure **ClosedFragment** is again based on the representation graph of  $C_D$ :

**ClosedFragment**( $C_D$ ,  $V_A$ ,  $\gamma_{SA}$ ;  $\overline{V}_A$ ,  $\overline{C}_A$ ,  $\overline{\gamma}_{SA}$ )

the set  $C_D$  of normalized constraints of the domain ontology input: the vocabulary  $V_A$  of the application ontology the source-to-application mapping  $\gamma_{SA}$ **output:** the new vocabulary  $\overline{V}_A$  of the application ontology the set of constraints  $\overline{C}_A$  of the application ontology the new source-to-application mapping  $\bar{\gamma}_{SA}$ **begin** Initialize  $\overline{V}_A = V_A$ ,  $\overline{C}_A = \emptyset$  and  $\overline{\gamma}_{SA} = \gamma_{SA}$ ; Construct  $G(C_D)$ , the constraint graph for  $C_D$ ; Mark all nodes of  $G(C_D)$  labeled with expressions that use only atomic concepts and atomic roles in  $V_A$ ; Create a new graph  $G_A$  by deleting any node N from  $G(C_D)$  such that N is labeled with positive expressions and N has no antecedent which is marked and labeled with a positive expression, or N is labeled with negative expressions and N has no descendent which is marked and labeled with a negative expression; Let AR be the set of atomic roles that occur in expressions that label nodes in  $G_A$ but which are not in  $V_A$ ; if AR is not empty, then stop warning that "a closed fragment cannot be automatically created"; Let AC be the set of atomic concepts that label nodes in  $G_A$  but which are not in  $V_A$ ; for each s in AC add s to  $\overline{V}_A$ ; **add** " $s \equiv s_1 \sqcup \ldots \sqcup s_n$ " to  $\bar{\gamma}_{SA}$ , where s labels a node M and  $s_1, \ldots, s_n$  label nodes  $M_1, \ldots, M_n$ , and  $M_1, \ldots, M_n$  are all nodes such that  $(M_k, M)$  is in  $G_A$ ; Recursively replace each  $s_i$  in a new definition " $s \equiv s_1 \sqcup ... \sqcup s_n$ " added to  $\bar{\gamma}_{SA}$ until the right-hand side of the definitions in  $\bar{\gamma}_{SA}$  contain only symbols in the vocabulary of the source ontology. for each arc (M,N) of  $G_A$ add  $e \sqsubseteq f$  to  $\overline{C}_A$  where e and f are expressions that label nodes M and N, respectively, and e and f are expression of  $V_A$ , and  $e \sqsubseteq f$  is an allowed constraint (in the sense of Section 2.), and  $\overline{f} \sqsubseteq \overline{e}$  is not already in  $\overline{C}_A$  /\* to avoid redundant constraints \*/ return  $\overline{V}_A$ ,  $\overline{C}_A$ ,  $\overline{\gamma}_{SA}$ ; end

We note that **ClosedFragment** is also non-deterministic. Furthermore, the recursive adjustment of the definitions added to  $\bar{\gamma}_{SA}$  is always possible since  $G(C_D)$  is acyclic, by Definition 3. The correctness of **ClosedFragment** also follows from the correctness of **IMPLIES**, introduced at the end of Section 2.3.

**Example 3**: Consider the same scenario as in Example 2. The goal now is to compute the constraints of *LPC* so that *LPC* is a closed fragment of *PC*. Recall that  $V_{LPC}$  is:

(1)  $V_{LPC} = \{ FixedPhone, RadioPhone, Number, MobileCall, mobPlacedBy \}$ 

Then, **ClosedFragment** outputs the new vocabulary:

(2)  $\overline{V}_{LPC} = \{ FixedPhone, RadioPhone, MobilePhone, Phone, Number, \}$ 

```
MobileCall, Call, mobPlacedBy }
```

and the normalized constraints shown in Figure 3. The new source-to-application mapping is defined in two stages. The first stage (in the first for-each loop of **ClosedFragment**) generates the following new definitions:

```
(3) a:MobilePhone≡a:RadioPhone
```

- (4) a:Phone = a:MobilePhone ⊔ a:FixedPhone
- (5) a:Call = a:MobileCall

Indeed, recall that Figure 2 shows  $G(C_{PC})$ , the representation graph for  $C_{PC}$ . Then, for example, the first loop generates the definition in (4) since the node labeled with Phone has two antecedents, labeled with FixedPhone and MobilePhone.

The second stage recursive replaces each symbol in  $\overline{V}_A$  that occurs on the right-hand side of (3), (4) or (5) by its definition in  $\overline{\gamma}_{SA}$  until the right-hand sides of all definitions in  $\overline{\gamma}_{SA}$  contain only symbols in  $V_S$ , the vocabulary of the source ontology.  $\Box$ 

(≥1 number) ⊑ Phone	Phone⊑¬(≥2 number)	FixedPhone ⊑ Phone
(≥1 mobPlacedBy) ⊑		MobilePhone ⊑ Phone
MobileCall		RadioPhone⊑MobilePhone
(≥1 mobPlacedBy <sup>-</sup> ) ⊑		MobilePhone ⊑ ¬FixedPhone
MobilePhone		MobileCall ⊑ Call

Fig. 3. Constraints of LPC when LPC is a closed fragment of PC.

# 4 Adjusting the source-to-application mapping

In this section, we discuss how to guarantee Requirement R2, namely:

R2. For any model s of  $C_s$ ,  $\hat{\gamma}_{sA}(s)$  is a model of  $C_A$ 

We reformulate R2 in a way that is both intuitive and amenable to mechanization. The essential problem is that  $C_A$  reflects  $C_D$ , the constraints of  $\mathcal{D}$ , rather than  $C_S$ , the constraints of  $\mathcal{S}$ . We then proceed as follows (the reader should pay attention to the subscripts used). Assume that, after the designer selects  $V_A$ , he also creates a set of constraints  $C_{AS}$ , written in  $V_A$ , that reflects  $C_S$ , in the sense that

R3. For any model *s* of  $C_s$ ,  $\hat{\gamma}_{sA}(s)$  is a model of  $C_{AS}$ 

We call  $C_{AS}$  the set of *endogenous constraints* of A and  $C_A$  the set of *exogenous constraints* of A. This choice of terms calls attention to the fact that  $C_{AS}$  reflects  $C_S$  whereas  $C_A$  reflects  $C_D$ . We then require that:

R4.  $C_{AS}$  logically implies  $C_A$ 

Note that R3 and R4 trivially imply R2. The question now is how to compute  $C_{AS}$  and perhaps adjust  $\gamma_{SA}$  so that they satisfy R3 and R4. In the rest of this section, we very briefly address this question.

We first illustrate how to compute  $C_{AS}$  so that it satisfies R3, when  $\gamma_{SA}$  is a renaming, which is perhaps the simplest case. Let  $V_{SA}$  be the subset of  $V_S$  such that U is in  $V_{SA}$  iff  $\gamma_{SA}$  has a definition of the form  $a:T \equiv s:U$ . Let  $C_{SA}$  be the set of constraints that procedure **OpenFragment** returns when called with parameters  $C_S$  and  $V_{SA}$ . Then, we know from Section 3.1 that  $C_{SA}$  is tautologically equivalent to  $C_S/V_{SA}$ , the set of formulas  $\sigma$  using only symbols in  $V_{SA}$  such that  $C_S$  logically implies $\sigma$ . We construct  $C_{AS}$  by applying the renaming  $\gamma_{SA}$  to  $C_{SA}$ , that is, in each constraint of  $C_{SA}$ , we replace U by T, whenever  $\gamma_{SA}$  has a definition of the form  $a:T \equiv s:U$ . Then,  $C_{AS}$  will satisfy R3.

With the help of an example, we now briefly sketch a method to modify  $\gamma_{SA}$  to guarantee R4 and yet maintain R3. The method explores the structural differences between the constraint graphs of  $C_{AS}$  and  $C_A$ .

**Example 4**: Assume that the application ontology is  $LPC2 = (V_{LPC2}, C_{LPC2})$ , where:

(1)  $V_{LPC2} = \{ MobilePhone, Number, MobileCall, mobPlacedBy \}$ 

and  $C_{LPC2}$  contains the following constraints (using the prefix "a:" to stress that the symbols are from  $V_{LPC2}$ , the application ontology vocabulary):

- (2)  $(\geq 1 \text{ a:mobPlacedBy}) \sqsubseteq a:MobileCall$
- (3)  $(\geq 1 \text{ a:mobPlacedBy}) \sqsubseteq a:MobilePhone$
- (4) a:MobilePhone  $\sqsubseteq \neg (\geq 2 a:number)$

Suppose that the source ontology is  $RPC = (V_{RPC}, C_{RPC})$ , where:

(5)  $V_{RPC} = \{$ Fixed, Nextel, id, PhoneCall, byFixed, byNextel $\}$ 

and  $C_{RPC}$  contains the following constraints (using the prefix "s:" to stress that the symbols are from  $V_{RPC}$ , the source ontology vocabulary):

- (6) ( $\geq$ 1 s:byFixed)  $\sqsubseteq$  s:PhoneCall
- (7) ( $\geq$ 1 s:byNextel)  $\sqsubseteq$  s:PhoneCall
- (8)  $(\geq 1 \text{ s:byFixed}) \subseteq \text{s:Fixed}$
- (9)  $(\geq 1 \text{ s:byNextel}) \sqsubseteq \text{ s:Nextel}$

Suppose also that the source-to-application mapping  $\gamma_{SA}$  contains the definitions:

```
(10) a:MobilePhone \equiv s:Nextel
```

```
(11) a:number \equiv s:id
```

```
(12) a:MobileCall \equiv s:PhoneCall \sqcap (>1 s:byNextel)
```

```
(13) a:mobPlacedBy \equiv s:byNextel
```

Then, the set of endogenous constraints,  $C_{LPC2, RPC}$ , contains just two constraints:

```
(14) (≥ 1 a:mobPlacedBy) ⊑ a:MobileCall
```

(15) ( $\geq$  1 a:mobPlacedBy)  $\sqsubseteq$  a:MobilePhone

Note that (14) follows from (13), (12) and (7), and (15) follows from (13), (10) and (9). We then modify the definitions in (10) to (13) by propagating backwards the expressions that label the nodes of the constraint graph  $G(C_{LPC2})$ . The propagation only follows arcs in  $G(C_{LPC2})$  that have no counterpart in  $G(C_{LPC2, RPC})$ . The modified source-to-application mapping will contain the following definitions:

```
(16) a:MobilePhone = s:Nextel \sqcap \neg (\geq 2 \text{ s:id})
```

```
(17) a:number \equiv s:id
```

```
(18) a:MobileCall = s:PhoneCall \sqcap (>1 s:byNextel)
```

```
(19) a:mobPlacedBy \equiv s:byNextel
```

Definition (16) follows from (10). Indeed,  $G(C_{LPC2})$  has an arc connecting nodes respectively labeled with a:MobilePhone and  $\neg (\ge 2 a:number)$  (derived from (4)), which is not in  $G(C_{LPC2, RPC})$ . Hence,  $\neg (\ge 2 a:number)$  has to be propagated to the definition of a:MobilePhone, as indicated in (16), with a:number replaced by its definition s:id, as indicated in (17). Under this new mapping, one may verify that R4 now holds and R3 still holds. Consequently, R2 is met.

# 5 Conclusions

In this paper, we introduced automatic methods for constructing application ontology constraints and for adjusting ontology mappings, when the application ontology is an open or a closed fragment of the domain ontology. The final set of constraints and the mappings will have useful properties, as detailed in Section 3.1 and 3.2. The methods assume that the ontologies are written in an expressive family of attributive languages and depend on a procedure to test logical implication, based on constraint graphs.

The results in the paper are directly mapped to the RDF context and cover a topic – the role that constraints play in Linked Data – that is much neglected in the literature. They also contribute to the investigation of triplification strategies for relational databases that properly consider relational constraints, such as keys and foreign keys.

As for current work, we are modifying a triplification tool [14] to generate application ontology constraints, as described in the paper. We are also extending the strategy for generating endogenous constraints, described in Section 4, to account for more complex source-to-ontology mappings, using results from [10].

# Acknowledgements

This work was partly supported by CNPq, under grants 473110/2008-3 and 557128/2009-9, by FAPERJ under grant E-26/170028/2008, and by CAPES under grant NF 21/2009.

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