# Urban Data Consistency in RDF: A Case Study of Curitiba Transportation System

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Abstract. Urban Computing has an important role in providing new tools for urban mobility. In this paper, integrity constraints and blank nodes are used in an RDF database to minimize extra updates (called side effects) to guarantee consistency during required updates. A case study using a real scenario on Curitiba/Brazil transportation database is presented. Experimental results showed that our approach performs better and produces more meaningful results when compared to a similar strategy.

#### 1. Introduction

The growth of urban centers sets several challenges to human well-being. Many of them are associated to urban mobility, such as traffic jams, energy consumption, security, long travel times, health issues due to emissions, and stress. New approaches are required to provide tools for managing a city in order to better serve its inhabitants. In this scenario, urban computing has emerged, to assist and improve the management of resources and decision making. It explores data generated by a diversity of sources in urban spaces, such as sensors, traffic devices, and vehicles.

Urban related data can come in different formats, and the problem of integrating these multitude of heterogeneous data sources carries the challenges of traditional integration applications. Moreover, there is a movement towards making urban data freely available to the public. This is in line with the principles of Linked Data, which is a set of recommended best practices for exposing, sharing, and connecting pieces of data, information, and knowledge on the Semantic Web. RDF is the standard model of the Semantic Web. The simplicity of the model, based on triples (subject, property, object), makes data interpretable by machines and humans. Moreover, RDF may come along with ontological information which associates semantics to the published information. In particular, the ability to express equivalences using *sameAs* properties can be used to state that individuals in distinct datasets refer to the same entity in the real world<sup>1</sup>. This ability allows one to traverse across several data sources, which is an important and desirable feature in the context of urban computing.

Linking data may result in huge datasets<sup>2</sup>. Keeping the consistency of such large datasets is a challenge. One traditional approach for keeping data consistent is to allow users to define constraints that are checked whenever the database is updated. In

<sup>&</sup>lt;sup>1</sup>https://www.w3.org/TR/owl-ref/

<sup>&</sup>lt;sup>2</sup>The 2016 release of DBPedia contains more than 1 billion triples.

[Halfeld-Ferrari et al. 2017], we have proposed a system, called BNS, that detects RDF constraint violations, and either refuses the update, or computes a set of compensation actions in order to guarantee their satisfaction. In this paper, we show how BNS can be applied on a urban setting, using transportation data of Curitiba, the capital of Paraná State in Brazil, as a case study.

Curitiba has developed and implemented mass transport corridors and mobility solutions using Bus Rapid Transit (BRT) systems in the 1970s, which have been featured in the Scientific American magazine [Rabinovitch and Leitman 1996]. The complete system, according to Curitiba's Institute of Research and Urban Planning (IPPUC)<sup>3</sup>, includes about 482 routes, distributed among 9940 bus stops, 23 bus terminals and 17 categories of streets [Kozievitch et al. 2016]. There are different types of routes: express routes, that defines the city spoke-shaped structural axes, inter-district and local lines, that fill the space between spokes, besides feeder, worker's routes and the city center line. Each type of route is identified by buses of different colors. We are going to focus on express and city center lines, which are illustrated in Figure 1. Express routes run in exclusive lanes using high capacity bi-articulated buses (called *Expresso*, in Portuguese), which transport up to 250 passengers per bus. They are identified by red vehicles. The city center line circles the downtown area in two directions, providing easy access to commerce, services, and points-of-interest, reducing the need for driving to the city and finding parking spots. As opposed to the huge *Expressos*, these routes use white minibuses, that pass every 8 minutes and complete the circle in about 35 minutes. They also have a cheaper fare, and only accept payment with the transportation card. In this scenario, this paper shows how the Curitiba urban transportation database were exported in RDF format and how constraints were managed by the BNS system in order to maintain the database consistency after insertion and deletion operations.

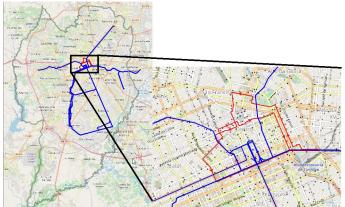




Figure 1. Corridors for BRT system (blue), city center bus line (red), and bus stops (black dots).

Figure 2. Expresso bus and a tube stop.

The rest of the paper is organized as follows. In section 2 we present the overall architecture of the system, and an example of the application of constraints for keeping the database consistency. Details of the BNS system are given in Section 3. In Section 4 we describe our new implementation of the system, which integrates the constraint man-

<sup>&</sup>lt;sup>3</sup>http://www.ippuc.org.br/ - Last visited on Feb 10, 2017.

agement system with a database system, and present some experimental results. Related work are discussed in Section 5, and Section 6 concludes the paper.

## 2. System Architecture

In this section we present the system components, the RDF database and the BNS system, as well as a motivating example to illustrate our main ideas. The RDF database has been generated by importing data from the Curitiba Urbanization Company (URBS). The resulting database contains RDF schema properties (such as *Class, Subclass, Domain, Range, Property and Sub-property*), as well as RDF triples. As an example, consider tables Route and Stop, illustrated in Figures 3(a) and (b), respectively, extracted from the URBS database. By joining these tables, we generated a set of triples, illustrated in Figure 3(c), that associate an express route (such as 302) to a bus stop by property ExpressLineStop<sup>4</sup>. We also store the class of each subject. For example, we keep the information that 302 is an ExpressLine and that Estação Tubo Germânia is a *tube* stop, as the one illustrated in Figure 2. The resulting RDF dataset contains 110,000 triples and 25,000 class instances using data from bus lines, bus stops and bus line characterization.

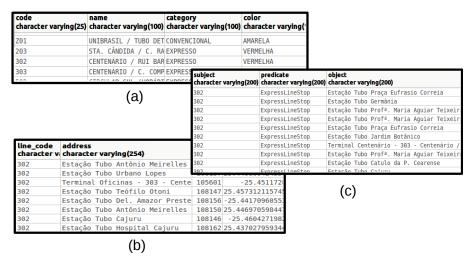


Figure 3. From the URBS Database to RDF triples.

The BNS system allows the user to define constraints such as: "every express line stop must be a fast boarding stop". Suppose that there are 3 types of stops: tube, terminal stop, and street stop, and that only the first two are considered as fast boarding. Consider now an update to the system, including a new stop, s1 to the express line 302. According to the constraint, s1 must be a fast boarding stop, and thus cannot be a street stop. However, if s1 is already stored in the database as a street stop, either: (i) the update operation is generating an inconsistency in the database, and thus should be rejected; or (ii) the database is inconsistent and s1 is indeed a fast boarding stop. The BNS system can help the detection of such inconsistencies because for every insertion or removal operation, it computes all additional updates that need to be executed in order to satisfy the existing constraints. In the above example, it will generate an operation to remove s1 from the class of street stops. However, removal operations as side-effects of facts in the database indicate potential sources of inconsistencies, which should be double checked by the user.

<sup>&</sup>lt;sup>4</sup>For simplicity, the examples keep the same identifiers used in the original tables instead of IRIs.

Figure 4 illustrates the proposed process. Given an RDF database D, we consider the existence of a set of application constraints ( $\mathcal{C}$ ) and RDF semantic constraints ( $\mathcal{A}$ ) defined on D. The input to the BNS System is a set of update operations (upd). The system computes the set of additional updates (side effects)  $U_S$  to keep the consistency in D, according to  $\mathcal{A}$  and  $\mathcal{C}$ . It is possible that operations in  $U_S$  may be contradictory among themselves. For example, one insertion operation in upd requires a stop to be fast boarding, while another update in upd requires the same stop to be a street stop. Since the update operations are contradictory, the BNS system automatically rejects the update set. If  $U_S$  does not contain contradictory operations, then  $U_S$  is checked against facts in the database. If there are side-effects that contradict facts already stored, user validation is required before applying the updates on the database. Next section presents details on the type of constraints considered by the BNS system, as well as the process for side-effects computation.

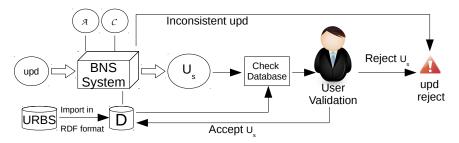


Figure 4. BNS System Process.

## 3. The Blank Node System (BNS)

Traditionally, whenever a database is updated, if constraint violations are detected, either the update is refused or compensation actions, which we call side-effects, must be executed in order to guarantee their satisfaction. In this section, we present the main ideas of the BNS system, which was proposed in [Halfeld-Ferrari et al. 2017]. It tackles the problem of "active rules" for RDF and computes the side-effects required by update operations. BNS is similar to the FKAC system [Flouris et al. 2013], but introduces blank nodes as free nulls, which are used as placeholders for unknown required data. As we will show in Section 4, this approach minimizes the number of side-effects and produce more meaningful results than the FKAC system. These features are important to help and reduce the burden of user validation.

**Application Constraint:** Let  $c_1, c_2$  be class labels, and  $p_1, p_2$  be property labels. Application constraints in C have the forms presented in Figure 5(a). As an example, constraint

 $r_1$  is of Type 1 and defines that minibuses are vehicles that accept only payment by transportation cards. Constraints  $r_2$  and  $r_3$  are of Type 2 and requires every express route to have a start stop and end stop (as opposed to the center city line, which has a closed trajectory). Constraint  $r_4$  is of Type 3, and defines that all stops for express lines are fast boarding stops. The following restrictions are imposed on  $\mathcal{C}$ : (1) for constraints r' of Type 2 there exists no constraint  $r'' \in \mathcal{C}$  such that head(r') and body(r'') are unifiable; (2) for constraints r' of Type 3 there exists no constraint  $r'' \in \mathcal{C}$  such that body(r') and head(r'') are unifiable. They aim at avoiding null propagation and at guaranteeing deterministic updates.

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Type 1:
CI(X_1, c_1) \rightarrow CI(X_1, c_2)
CI(X_1, c_1) \to \neg CI(X_1, c_2)
                                                       CI(V, Minibus) \rightarrow CI(V, CardOnly)
                                               r_1:
PI(X_1, X_2, p_1) \rightarrow PI(X_1, X_2, p_2)
                                                       CI(L, ExpressLine) \rightarrow PI(S, L, StartStop)
                                               r_2:
PI(X_1, X_2, p_1) \to \neg PI(X_1, X_2, p_2)
                                                       CI(L, ExpressLine) \rightarrow PI(S, L, EndStop)
                                               r_3:
Type 2:
                                                       PI(S, L, ExpressLineStop) \rightarrow CI(S, FastBoarding)
CI(X_1, c_1) \rightarrow PI(X_1, X_2, p_1)
                                               r_4:
CI(X_1,c_1) \rightarrow \neg PI(X_1,X_2,p_1)
                                                       CI(S, Tube) \rightarrow CI(S, FastBoarding)
                                              r_5:
CI(X_2,c_1) \rightarrow PI(X_1,X_2,p_1)
                                                       CI(S, Terminal) \rightarrow CI(S, FastBoarding)
                                               r_6:
CI(X_2, c_1) \rightarrow \neg PI(X_1, X_2, p_1)
                                                       \overline{CI(S, StreetStop)} \rightarrow \neg CI(S, FastBoarding)
                                               r_7:
PI(X_1, X_2, p_1) \rightarrow CI(X_1, c_1)
                                                       PI(S, L, ExpressLineStop) \rightarrow CI(L, ExpressLine)
                                               r_8:
PI(X_1, X_2, p_1) \rightarrow \neg CI(X_1, c_1)
                                                       PI(S, L, ExpressVehicle) \rightarrow CI(L, ExpressLine)
                                               r_9:
PI(X_1, X_2, p_1) \rightarrow CI(X_2, c_1)
                                                       PI(S, L, ExpressLineStop) \rightarrow CI(S, ExpressStop)
                                               r_{10}:
PI(X_1, X_2, p_1) \rightarrow \neg CI(X_2, c_1)
                                                                             (b)
                   (a)
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Figure 5. Constraint types and definitions.

We now turn to the problem of side-effects computation. Consider the insertion of the fact CI(LineA, ExpressLine). The simple addition of this fact in the database renders it inconsistent because according to rules  $r_2$  and  $r_3$ , every express line is required to have a start and end stop. Thus, the following side effects are produced: (i) rule  $r_2$  generates  $PI(Null_1, LineA, StartStop)$ , and (ii) rule  $r_3$  produces  $PI(Null_2, LineA, EndStop)$ .  $Null_1$  and  $Null_2$  are placeholders, indicating that LineA has a start and end stops, although it is not yet known which ones.

Consider now the deletion of f = PI(Stop2, LineA, StartStop). To avoid the violation of  $r_2$  we cannot just eliminate f from the database D. The solution proposed by the FKAC system is to delete all facts that require the existence of f, which results in cascading deletion operations. The application of constraint  $r_2$ , generates the removal of CI(LineA, LineExpress), which in turn produces the removal of all ExpressLineStops by  $r_8$ . Such a solution seems too radical. The BNS system adopts a different approach, which is similar to the "on delete set null" strategy, and generates a single side-effect operation, which is the inclusion of a blank node the replaces LineA start stop. That is, the removal of PI(Stop2, LineA, StartStop) generates as side-effect  $PI(Null_1, LineA, StartStop)$ .

**RDF Intrinsic Semantic Constraint:** Besides satisfying the application constraints, an RDF database should also respect the intrinsic RDF schema semantic constraints ( $\mathcal{A}$ ). Thus, following the same reasoning used for constraints in  $\mathcal{C}$ , our approach proposes to generate additional updates in order to maintain consistency w.r.t.  $\mathcal{A}$ . Constraints in  $\mathcal{A}$  are those presented in Tables 1 and 2. Here, Cl(c) defines that c is a class, Pr(p) defines p as a property,  $Csub(c_1, c_2)$  defines subclass relationships,  $Psub(p_1, p_2)$  defines sub-property relationships, and Rng(p,c) and Dom(p,c) define the range and domain of properties. Table 1 borrows from [Flouris et al. 2013] a subset of the RDF semantic constraints and Table 2 presents the rules that have been modified and added in order to consider the

existence of nulls (blank nodes - BN).

Table 1. Subset of rules from [Flouris et al. 2013]

$m_1$ :	$Cl(x) \land Pr(y) \rightarrow (x \neq y)$
$m_2$ :	$Cl(x) \rightarrow Csub(x, rdfs:Resource)$
$m_3$ :	$Ind(x) \rightarrow CI(x, rdfs:Resource)$
$m_4$ :	$Csub(x,y) \wedge Csub(y,z) \rightarrow Csub(x,z)$
$m_5$ :	$Pr(x) \rightarrow Dom(x,y) \land Rng(x,z)$
$m_6$ :	$CI(x,y) \rightarrow Ind(x)$
$m_7$ :	$CI(x,y) \rightarrow Cl(y) \lor (y=rdfs:Resource)$
$m_8$ :	$PI(x,y,z) \rightarrow Pr(z)$
$m_9$ :	$CI(x,y) \wedge Csub(y,z) \rightarrow CI(x,z)$
$m_{10}$ :	$PI(x,y,z) \land Psub(z,w) \rightarrow PI(x,y,w)$

Table 2. Rules that involve blank nodes

$b_1$ :	$Pr(x) \land BN(y) \rightarrow (x \neq y)$
$b_2$ :	$Ind(x) \land BN(y) \to (x \neq y)$
<i>b</i> <sub>3</sub> :	$Cl(x) \land BN(y) \rightarrow (x \neq y)$
$b_4$ :	$PI(x,y,z) \land \neg BN(x) \to Ind(x)$
b <sub>5</sub> :	$PI(x,y,z) \land \neg BN(y) \land \neg Lit(y) \rightarrow Ind(y)$
b <sub>6</sub> :	PI $(x,y,z) \land Dom(z,w) \land \neg BN(x) \rightarrow$
	CI(x,w)
b <sub>7</sub> :	$PI(x,y,z) \land Rng(z,w) \land \neg BN(y) \rightarrow$
	$CI(y,w) \lor (Lit(y) \land (w=rdfs:Literal))$

## 4. Experimental Study

In [Halfeld-Ferrari et al. 2017] we reported experiments of the BNS system implemented with the Standard ML of New Jersey compiler, and constraints defined on Berlin and LUBM benchmarks. While in the previous implementation data were stored on regular files, we have re-engineered the system in SML# [Ohori and Ueno 2011] to access data stored on a Postgres database, pushing some filter expressions to the DBMS. Although not all DBMS optimizations were explored, the execution time of the system has improved drastically. Moreover, here we consider a real urban dataset and constraints, as exemplified in Section 2.

We report experimental results comparing the BNS and FKAC systems. As pointed out in Section 3, one important difference between the FKAC and BNS systems concerns the ability to generate and store null values. As the FKAC system *does not consider nulls*, when an insertion imposes the existence of an unknown required data, it may arbitrarily choose an entity to play the required role. As an example, consider again the insertion of CI(LineA, ExpressLine). Since  $r_2$  requires LineA to have start and end stops, the system may arbitrarily choose any ExpressLineStops  $s_1$ ,  $s_2$ , and generate as side-effects  $PI(s_1, LineA, StartStop)$ , and  $PI(s_2, LineA, EndStop)$ . Worse still, when in a later time, the real start and end stops were inserted, it is up to the user to remove the previous arbitrary ones. In contrast, BNS stores null values which can be *automatically* replaced by facts introduced by the user in a later time. This strategy helps the user validation process and produce operations that are semantically more meaningful. Besides, our experiments results show that BNS reduces the number of side-effects.

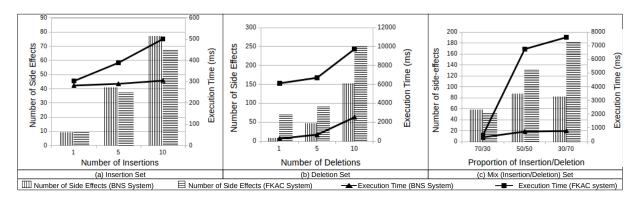


Figure 6. Results for URBS Database.

In Figure 6, the bars show the final update size with side-effects, while the lines present the execution time. Each experiment setting has been executed 5 times. The first two were for warm up and the reported results are the average values of the following 3 executions.<sup>5</sup>. Figure 6(a) show results when considering only insertion operations. In this setting, the number of side-effects in the BNS system is larger than in the FKAC system. This is caused by the intrinsic semantic constraints concerning nulls in the BNS system. Consider again the insertion of CI(LineA, ExpressLine). While FKAC generates as side-effects  $PI(s_1, LineA, StartStop)$ , and  $PI(s_2, LineA, EndStop)$ , BNS generates  $PI(Null_1, LineA, StartStop)$ StartStop), and PI(Null<sub>2</sub>, LineA, EndStop), and also CI(Null<sub>1</sub>,rdfs:resource), BN(Null<sub>1</sub>), CI(Null<sub>2</sub>,rdfs:resource), and BN(Null<sub>2</sub>) to satisfy the constraints depicted in Table 2. Even producing a larger set of side-effects, the BNS system is still faster because FKAC has to search the database for a subject (or object) of the property domain (or range) type. Figure 6(b) considers only deletions operations. In this case the BNS System is faster and produces smaller sets of side-effects. Figure 6(c) shows the results when we mix insertion and deletions operations. When there are a larger number of insertions, both the execution time and amount of side-effects are similar for both systems. When the number of deletion operations increases, both parameters grow faster for the FKAC system.

### 5. Related Work

Mechanisms to control frequent updates on RDF are desirable [Magiridou et al. 2005] and have been proposed in several works such as [Flouris et al. 2013] and [Frommhold et al. 2016]. RDF/S update and consistency maintenance approaches in [Flouris et al. 2013, Magiridou et al. 2005, Solimando and Guerrini 2013] do not consider blank nodes. In [Muñoz 2016] integrity constraints are used to extract information about the RDF database. Blank nodes have been used in different contexts such as for version control [Völkel and Groza, Frommhold et al. 2016] and ontology evolution [Faisal et al. 2016]. In [Mallea et al. 2011] blank node existential semantics in RDF/S and query languages is explored. Several works explore constraints on urban transportation scenarios, but in different contexts, such as location modeling [Li and Tong 2017], optimization [Yang et al. 2000], complex network metrics [da Silva et al. 2016, De Bona et al. 2016], and exploratory analysis [Kozievitch et al. 2017].

#### 6. Conclusion

The case study presented in this paper shows the application of constraints on an RDF dataset containing Curitiba urban transportation data. These constraints assist the user during insertion and deletion operations, generating side effects to keep the database consistency. An experimental study showed that our system performs better and produces smaller sets of side effects when compared to a similar strategy. Moreover, the resulting operations are semantically more meaningful, since our strategy does not introduce arbitrary facts in order to satisfy the application constraints. When applied to the Curitiba urban transportation database, our strategy allows the user to validate the final update set, reducing the chances of introducing inconsistencies.

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<sup>&</sup>lt;sup>5</sup>Updates used in this experiment are available at http://www.inf.ufpr.br/fruber/BNS.

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