# A Normal Form for XML Documents

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This article takes a first step towards the design and normalization theory for XML documents. We show that, like relational databases, XML documents may contain redundant information, and may be prone to update anomalies. Furthermore, such problems are caused by certain functional dependencies among paths in the document. Our goal is to find a way of converting an arbitrary DTD into a well-designed one, that avoids these problems. We first introduce the concept of a functional dependency for XML, and define its semantics via a relational representation of XML. We then define an XML normal form, XNF, that avoids update anomalies and redundancies. We study its properties, and show that XNF generalizes BCNF; we also discuss the relationship between XNF and normal forms for nested relations. Finally, we present a lossless algorithm for converting any DTD into one in XNF.

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## 1. INTRODUCTION

The concepts of database design and normal forms are a key component of the relational database technology. In this article, we study design principles for XML data. XML has recently emerged as a new basic format for data exchange. Although many XML documents are views of relational data, the number of applications using native XML documents is increasing rapidly. Such applications may use native XML storage facilities [Kanne and Moerkotte 2000], and update XML data [Tatarinov et al. 2001]. Updates, like in relational databases, may cause anomalies if data is redundant. In the relational world, anomalies are avoided by using well-designed database schema. XML has its version of schema too; most often it is DTDs (Document Type Definitions), and some

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other proposals exist or are under development [W3C 2001, 1998]. What would it mean then for such a schema to be well or poorly designed? Clearly, this question has arisen in practice: one can find companies offering help in "good DTD design." This help, however, comes in form of consulting services rather than commercially available software, as there are no clear guidelines for producing well-designed XML.

Our goal is to find principles for good XML data design, and algorithms to produce such designs. We believe that it is important to do this research now, as a lot of data is being put on the web. Once massive web databases are created, it is very hard to change their organization; thus, there is a risk of having large amounts of widely accessible, but at the same time poorly organized legacy data.

Normalization is one of the most thoroughly researched subjects in database theory (a survey [Beeri et al. 1978] produced many references more than 20 years ago), and cannot be reconstructed in a single article in its entirety. Here we follow the standard treatment of one of the most common (if not the most common) normal forms, BCNF. It eliminates redundancies and avoids update anomalies which they cause by decomposing into relational subschemas in which every nontrivial functional dependency defines a key. Just to retrace this development in the XML context, we need the following:

- (a) Understanding of what a redundancy and an update anomaly is.
- (b) A definition and basic properties of functional dependencies (so far, most proposals for XML constraints concentrate on keys).
- (c) A definition of what "bad" functional dependencies are (those that cause redundancies and update anomalies).
- (d) An algorithm for converting an arbitrary DTD into one that does not admit such bad functional dependencies.

Starting with point (a), how does one identify bad designs? We have looked at a large number of DTDs and found two kinds of commonly present design problems. They are illustrated in two examples below.

*Example* 1.1. Consider the following DTD that describes a part of a university database:



Fig. 1. A document containing redundant information.

For every course, we store its number (cno), its title and the list of students taking the course. For each student taking a course, we store his/her number (sno), name, and the grade in the course.

An example of an XML document that conforms to this DTD is shown in Figure 1. This document satisfies the following constraint: any two student elements with the same sno value must have the same name. This constraint (which looks very much like a functional dependency), causes the document to store redundant information: for example, the name Deere for student st1 is stored twice. And just as in relational databases, such redundancies can lead to update anomalies: for example, updating the name of st1 for only one course results in an inconsistent document, and removing the student from a course may result in removing that student from the document altogether.

In order to eliminate redundant information, we use a technique similar to the relational one, and split the information about the name and the grade. Since we deal with just one XML document, we must do it by creating an extra element type, info, for student information, as shown below:

```
<!DOCTYPE courses [
  <!ELEMENT courses (course*, info*)>
  <!ELEMENT course (title,taken_by)>
    <!ATTLIST course
              cno CDATA #REQUIRED>
  <!ELEMENT title (#PCDATA)>
  <!ELEMENT taken_by (student*)>
  <!ELEMENT student (grade)>
    <!ATTLIST student
              sno CDATA #REQUIRED>
  <!ELEMENT grade (#PCDATA)>
  <!ELEMENT info (number*,name)>
  <!ELEMENT number EMPTY>
    <! ATTLIST number
              sno CDATA #REQUIRED>
  <!ELEMENT name (#PCDATA)>
1>
```



Fig. 2. A well-designed document.

Each info element has as children one name and a sequence of number elements, with sno as an attribute. Different students can have the same name, and we group all student numbers sno for each name under the same info element. A restructured document that conforms to this DTD is shown in Figure 2. Note that st2 and st3 are put together because both students have the same name.

This example is reminiscent of the canonical example of bad relational design caused by nonkey functional dependencies, and so is the modification of the schema. Some examples of redundancies are more closely related to the hierarchical structure of XML documents.

*Example* 1.2. The DTD below is a part of the DBLP database [Ley 2003] for storing data about conferences.

```
<!DOCTYPE db [
    <!ELEMENT db (conf*)>
    <!ELEMENT conf (title, issue+)>
    <!ELEMENT title (#PCDATA)>
    <!ELEMENT issue (inproceedings+)>
    <!ELEMENT inproceedings (author+, title)>
        <!ATTLIST inproceedings
            key ID #REQUIRED
            pages CDATA #REQUIRED
            year CDATA #REQUIRED
            year CDATA #REQUIRED>
        <!ELEMENT author (#PCDATA)>
```

]>

Each conference has a title, and one or more issues (which correspond to years when the conference was held). Papers are stored in inproceedings elements; the year of publication is one of its attributes.

Such a document satisfies the following constraint: any two inproceedings children of the same issue must have the same value of year. This too is similar to relational functional dependencies, but now we refer to the values (the year attribute) as well as the structure (children of the same issue). Moreover, we only talk about inproceedings nodes that are children of the same issue element. Thus, this functional dependency can be considered relative to each issue.

The functional dependency here leads to redundancy: year is stored multiple times for a conference. The natural solution to the problem in this case is not to

create a new element for storing the year, but rather restructure the document and make year an attribute of issue. That is, we change attribute lists as:

```
<!ATTLIST issue
year CDATA #REQUIRED>
<!ATTLIST inproceedings
key ID #REQUIRED
pages CDATA #REQUIRED>
```

Our goal is to show how to detect anomalies of those kinds, and to transform documents in a lossless fashion into ones that do not suffer from those problems.

The first step towards that goal is to introduce functional dependencies (FDs) for XML documents. So far, most proposals for XML constraints deal with keys and foreign keys [Buneman et al. 2001a, 2001b; W3C 2001]. We introduce FDs for XML by considering a relational representation of documents and defining FDs on them. The relational representation is somewhat similar to the total unnesting of a nested relation [Suciu 1997; Van den Bussche 2001]; however, we have to deal with DTDs that may contain arbitrary regular expressions, and be recursive. Our representation via *tree tuples*, introduced in Section 3, may contain null values. In Section 4, XML FDs are introduced via FDs on incomplete relations [Atzeni and Morfuni 1984; Levene and Loizou 1998].

The next step is the definition of a normal form that disallows redundancycausing FDs. We give it in Section 5, and show that our normal form, called XNF, generalizes BCNF and a nested normal form NNF [Mok et al. 1996] when only functional dependencies are considered (see Section 5.2 for a precise statement of this claim).

The last step then is to find an algorithm that converts any DTD, given a set of FDs, into one in XNF. We do this in Section 6. On both examples shown earlier, the algorithm produces exactly the desired reconstruction of the DTD. The main algorithm uses implication of functional dependencies (although there is a version that does not use implication, but it may produce suboptimal results). In Section 7, we show that for a large class of DTDs, covering most DTDs that occur in practice, the implication problem is tractable (in fact, quadratic). Finally, in Section 8 we describe related work and some topics of future research.

One of the reasons for the success of the normalization theory is its simplicity, at least for the commonly used normal forms such as BCNF, 3NF and 4NF. Hence, the normalization theory for XML should not be extremely complicated in order to be applicable. In particular, this was the reason we chose to use DTDs instead of more complex formalisms [W3C 2001]. This is in perfect analogy with the situation in the relational world: although SQL DDL is a rather complicated language with numerous features, BCNF decomposition uses a simple model of a set of attributes and a set of functional dependencies.

# 2. NOTATIONS

Assume that we have the following disjoint sets: *El* of element names, *Att* of attribute names, *Str* of possible values of string-valued attributes, and *Vert* of node identifiers. All attribute names start with the symbol @, and these are the

only ones starting with this symbol. We let  ${\tt S}$  and  $\perp$  (null) be reserved symbols not in any of those sets.

*Definition* 2.1. A *DTD* (Document Type Definition) is defined to be D = (E, A, P, R, r), where:

 $-E \subseteq El$  is a finite set of *element types*.

 $-A \subseteq Att$  is a finite set of *attributes*.

− *P* is a mapping from *E* to *element type definitions*. Given  $\tau \in E$ ,  $P(\tau) = S$  or  $P(\tau)$  is a regular expression *α* defined as follows:

$$\alpha ::= \epsilon \mid \tau' \mid \alpha \mid \alpha \mid \alpha, \alpha \mid \alpha^*$$

where  $\epsilon$  is the empty sequence,  $\tau' \in E$ , and "|", "," and "\*" denote union, concatenation, and the Kleene closure, respectively.

- *R* is a mapping from *E* to the powerset of *A*. If  $@l \in R(\tau)$ , we say that @l is *defined for*  $\tau$ .
- $-r \in E$  and is called *the element type of the root*. Without loss of generality, we assume that *r* does not occur in  $P(\tau)$  for any  $\tau \in E$ .

The symbols  $\epsilon$  and S represent element type declarations EMPTY and #PCDATA, respectively.

Given a DTD D = (E, A, P, R, r), a string  $w = w_1 \cdots w_n$  is a *path* in D if  $w_1 = r$ ,  $w_i$  is in the alphabet of  $P(w_{i-1})$ , for each  $i \in [2, n-1]$ , and  $w_n$  is in the alphabet of  $P(w_{n-1})$  or  $w_n = @l$  for some  $@l \in R(w_{n-1})$ . We define *length(w)* as *n* and *last(w)* as  $w_n$ . We let *paths(D)* stand for the set of all paths in D and *EPaths(D)* for the set of all paths that ends with an element type (rather than an attribute or S); that is, *EPaths(D)* = { $p \in paths(D) \mid last(p) \in E$ }. A DTD is called *recursive* if *paths(D)* is infinite.

*Definition 2.2.* An *XML tree T* is defined to be a tree (*V*, *lab*, *ele*, *att*, *root*), where

- $-V \subseteq$  *Vert* is a finite set of *vertices* (*nodes*).
- $-lab: V \to El.$
- $-ele: V \to Str \cup V^*.$
- *att* is a partial function  $V \times Att \rightarrow Str$ . For each  $v \in V$ , the set  $\{@l \in Att | att(v, @l) \text{ is defined}\}$  is required to be finite.
- *root*  $\in$  *V* is called *the root of T*.

The parent-child edge relation on V,  $\{(v_1, v_2) | v_2 \text{ occurs in } ele(v_1)\}$ , is required to form a rooted tree.

Notice that we do not allow mixed content in XML trees. The children of an element node can be either zero or more element nodes or one string.

Given an XML tree *T*, a string  $w_1 \cdots w_n$ , with  $w_1, \ldots, w_{n-1} \in El$  and  $w_n \in El \cup Att \cup \{S\}$ , is a *path* in *T* if there are vertices  $v_1 \cdots v_{n-1}$  in *V* such that:

- $-v_1 = root$ ,  $v_{i+1}$  is a child of  $v_i$   $(1 \le i \le n-2)$ ,  $lab(v_i) = w_i$   $(1 \le i \le n-1)$ .
- —If  $w_n \in El$ , then there is a child  $v_n$  of  $v_{n-1}$  such that  $lab(v_n) = w_n$ . If  $w_n = @l$ , with  $@l \in Att$ , then  $att(v_{n-1}, @l)$  is defined. If  $w_n = S$ , then  $v_{n-1}$  has a child in *Str*.

We let *paths*(*T*) stand for the set of paths in *T*. We next give a standard definition of a tree conforming to a DTD ( $T \models D$ ) as well as a weaker version of *T* being compatible with D ( $T \triangleleft D$ ).

*Definition* 2.3. Given a DTD D = (E, A, P, R, r) and an XML tree T = (V, lab, ele, att, root), we say that T conforms to D ( $T \models D$ ) if

- -lab is a mapping from V to E.
- —For each  $v \in V$ , if P(lab(v)) = S, then ele(v) = [s], where  $s \in Str$ . Otherwise,  $ele(v) = [v_1, \ldots, v_n]$ , and the string  $lab(v_1) \cdots lab(v_n)$  must be in the regular language defined by P(lab(v)).
- *att* is a partial function from  $V \times A$  to *Str* such that for any  $v \in V$  and  $@l \in A$ , *att*(v, @l) is defined iff  $@l \in R(lab(v))$ .
- -lab(root) = r.

We say that *T* is compatible with *D* (written  $T \triangleleft D$ ) iff paths(*T*)  $\subseteq$  paths(*D*).

Clearly,  $T \models D$  implies *T* is compatible with *D*.

## 3. TREE TUPLES

To extend the notions of functional dependencies to the XML setting, we represent XML trees as sets of tuples. While various mappings from XML to the relational model have been proposed [Florescu and Kossmann 1999; Shanmugasundaram et al. 1999], the mapping that we use is of a different nature, as our goal is not to find a way of storing documents efficiently, but rather find a correspondence between documents and relations that lends itself to a natural definition of functional dependency.

Various languages proposed for expressing XML integrity constraints such as keys [Buneman et al. 2001a, 2001b; W3C 2001], treat XML trees as unordered (for the purpose of defining the semantics of constraints): that is, the order of children of any given node is irrelevant as far as satisfaction of constraints is concerned. In XML trees, on the other hand, children of each node are ordered. Since the notion of functional dependency we propose also does not use the ordering in the tree, we first define a notion of subsumption that disregard this ordering.

Given two XML trees  $T_1 = (V_1, lab_1, ele_1, att_1, root_1)$  and  $T_2 = (V_2, lab_2, ele_2, att_2, root_2)$ , we say that  $T_1$  is subsumed by  $T_2$ , written as  $T_1 \leq T_2$  if

- $-V_1 \subseteq V_2.$
- $-root_1 = root_2.$
- $-lab_{2}_{\upharpoonright V_1} = lab_1.$
- $-att_{2}_{V_1\times Att} = att_1.$
- —For all  $v \in V_1$ ,  $ele_1(v)$  is a sublist of a permutation of  $ele_2(v)$ .

This relation is a pre-order, which gives rise to an equivalence relation:  $T_1 \equiv T_2$  iff  $T_1 \preceq T_2$  and  $T_2 \preceq T_1$ . That is,  $T_1 \equiv T_2$  iff  $T_1$  and  $T_2$  are equal as unordered trees. We define [T] to be the  $\equiv$ -equivalence class of T. We write  $[T] \models D$  if  $T_1 \models D$  for some  $T_1 \in [T]$ . It is easy to see that for any  $T_1 \equiv T_2$ ,

*paths*( $T_1$ ) = *paths*( $T_2$ ); hence,  $T_1 \triangleleft D$  iff  $T_2 \triangleleft D$ . We shall also write  $T_1 \prec T_2$  when  $T_1 \preceq T_2$  and  $T_2 \not\preceq T_1$ .

In the following definition, we extend the notion of tuple for relational databases to the case of XML. In a relational database, a tuple is a function that assigns to each attribute a value from the corresponding domain. In our setting, a tree tuple *t* in a DTD *D* is a function that assigns to each path in *D* a value in  $Vert \cup Str \cup \{\bot\}$  in such a way that *t* represents a finite tree with paths from *D* containing at most one occurrence of each path. In this section, we show that an XML tree can be represented as a set of tree tuples.

*Definition* 3.1 (*Tree tuples*). Given a DTD D = (E, A, P, R, r), a *tree tuple t in D* is a function from *paths*(*D*) to *Vert*  $\cup$  *Str*  $\cup$  { $\bot$ } such that:

—For  $p \in EPaths(D)$ ,  $t(p) \in Vert \cup \{\bot\}$ , and  $t(r) \neq \bot$ .

-For  $p \in paths(D) - EPaths(D), t(p) \in Str \cup \{\bot\}$ .

-If  $t(p_1) = t(p_2)$  and  $t(p_1) \in Vert$ , then  $p_1 = p_2$ .

—If  $t(p_1) = \bot$  and  $p_1$  is a prefix of  $p_2$ , then  $t(p_2) = \bot$ .

 $-\{p \in paths(D) \mid t(p) \neq \bot\}$  is finite.

 $\mathcal{T}(D)$  is defined to be the set of all tree tuples in *D*. For a tree tuple *t* and a path *p*, we write *t*. *p* for t(p).

*Example* 3.2. Suppose that D is the DTD shown in Example 1.1. Then a tree tuple in D assigns values to each path in *paths*(D):

```
t(courses) = v_0

t(courses.course) = v_1

t(courses.course.@cno) = \csc 200

t(courses.course.title) = v_2

t(courses.course.title.S) = Automata Theory

t(courses.course.taken_by) = v_3

t(courses.course.taken_by.student) = v_4

t(courses.course.taken_by.student.@sno) = st1

t(courses.course.taken_by.student.name) = v_5

t(courses.course.taken_by.student.name.S) = Deere

t(courses.course.taken_by.student.grade) = v_6

t(courses.course.taken_by.student.grade.S) = A+
```

We intend to consider tree tuples in XML trees conforming to a DTD. The ability to map a path to null  $(\perp)$  allow one in principle to consider tuples with paths that do not reach the leaves of a give tree, although our intention is to consider only paths that do reach the leaves. However, nulls are still needed in tree tuples because of the disjunction in DTDs. For example, let D = (E, A, P,R, r), where  $E = \{r, a, b\}$ ,  $A = \emptyset$ , P(r) = (a|b),  $P(a) = \epsilon$  and  $P(b) = \epsilon$ . Then  $paths(D) = \{r, r.a, r.b\}$  but no tree tuple coming from an XML tree conforming to D can assign nonnull values to both r.a and r.b.

If *D* is a recursive DTD, then paths(D) is infinite; however, only a finite number of values in a tree tuple are different from  $\bot$ . For each tree tuple *t*, its nonnull values give rise to an XML tree as follows.

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Definition 3.3 (tree<sub>D</sub>). Given a DTD D = (E, A, P, R, r) and a tree tuple  $t \in T(D)$ , tree<sub>D</sub>(t) is defined to be an XML tree (V, lab, ele, att, root), where root = t.r and

 $-V = \{v \in Vert \mid \exists p \in paths(D) \text{ such that } v = t. p\}.$ 

-If v = t. *p* and  $v \in V$ , then lab(v) = last(p).

-If v = t. p and  $v \in V$ , then *ele*(v) is defined to be the list containing { $t. p' \mid t. p' \neq \bot$  and  $p' = p.\tau, \tau \in E$ , or p' = p.S}, ordered lexicographically.

-If v = t. p,  $@l \in A$  and  $t. p.@l \neq \bot$ , then att(v, @l) = t. p.@l.

We note that, in this definition, the lexicographic order is arbitrary, and it is chosen simply because an XML tree must be ordered.

*Example* 3.4. Let *D* be the DTD from Example 1.1 and *t* the tree tuple from Example 3.2. Then, *t* gives rise to the following XML tree:



Notice that the tree in the example conforms to the DTD from Example 1.1. In general, this need not be the case. For instance, if the rule <!ELEMENT taken\_by (student\*)> in the DTD shown in Example 1.1 is changed by a rule saying that every course must have at least two students <!ELEMENT taken\_by (student, student+)>, then the tree shown in Example 3.4 does not conform to the DTD. However,  $tree_D(t)$  would always be compatible with D, as easily follows from the definition:

**PROPOSITION 3.5.** If  $t \in \mathcal{T}(D)$ , then  $tree_D(t) \triangleleft D$ .

We would like to describe XML trees in terms of the tuples they contain. For this, we need to select tuples containing the maximal amount of information. This is done via the usual notion of ordering on tuples (and relations) with nulls [Buneman et al. 1991; Grahne 1991; Gunter 1992]. If we have two tree tuples  $t_1$ ,  $t_2$ , we write  $t_1 \sqsubseteq t_2$  if whenever  $t_1 . p$  is defined, then so is  $t_2 . p$ , and  $t_1 . p \neq \bot$  implies  $t_1 . p = t_2 . p$ . As usual,  $t_1 \sqsubset t_2$  means  $t_1 \sqsubseteq t_2$  and  $t_1 \neq t_2$ . Given two sets of tree tuples, X and Y, we write  $X \sqsubseteq^{\flat} Y$  if  $\forall t_1 \in X \exists t_2 \in Y t_1 \sqsubseteq t_2$ .

*Definition* 3.6 (*tuples*<sub>D</sub>). Given a DTD *D* and an XML tree *T* such that  $T \triangleleft D$ , *tuples*<sub>D</sub>(*T*) is defined to be the set of maximal, with respect to  $\sqsubseteq$ , tree

tuples *t* such that  $tree_D(t)$  is subsumed by *T*; that is:

$$max_{\Box} \{ t \in \mathcal{T}(D) \mid tree_D(t) \leq T \}.$$

Observe that  $T_1 \equiv T_2$  implies  $tuples_D(T_1) = tuples_D(T_2)$ . Hence,  $tuples_D$  applies to equivalence classes:  $tuples_D([T]) = tuples_D(T)$ . The following proposition lists some simple properties of  $tuples_D(\cdot)$ .

PROPOSITION 3.7. If  $T \triangleleft D$ , then  $tuples_D(T)$  is a finite subset of  $\mathcal{T}(D)$ . Furthermore,  $tuples_D(\cdot)$  is monotone:  $T_1 \preceq T_2$  implies  $tuples_D(T_1) \sqsubseteq^{\flat} tuples_D(T_2)$ .

PROOF. We prove only monotonicity. Suppose that  $T_1 \leq T_2$  and  $t_1 \in tuples_D(T_1)$ . We have to prove that there exists  $t_2 \in tuples_D(T_2)$  such that  $t_1 \sqsubseteq t_2$ . If  $t_1 \in tuples_D(T_2)$ , this is obvious, so assume that  $t_1 \notin tuples_D(T_2)$ . Given that  $t_1 \in tuples_D(T_1)$ ,  $tree_D(t_1) \leq T_1$ , and, therefore,  $tree_D(t_1) \leq T_2$ . Hence, by definition of  $tuples_D(\cdot)$ , there exists  $t_2 \in tuples_D(T_2)$  such that  $t_1 \sqsubset t_2$ , since  $t_1 \notin tuples_D(T_2)$ .  $\Box$ 

*Example* 3.8. In Example 1.1, we saw a DTD D and a tree T conforming to D. In Example 3.2, we saw one tree tuple t for that tree, with identifiers assigned to some of the element nodes of T. If we assign identifiers to the rest of the nodes, we can compute the set  $tuples_D(T)$  (the attributes are sorted as in Example 3.2):

 $\{(v_0, v_1, \csc 200, v_2, \text{Automata Theory}, v_3, v_4, \text{st1}, v_5, \text{Deere}, v_6, \text{A+}), \}$ 

- (*v*<sub>0</sub>, *v*<sub>1</sub>, csc200, *v*<sub>2</sub>, Automata Theory, *v*<sub>3</sub>, *v*<sub>7</sub>, st2, *v*<sub>8</sub>, Smith, *v*<sub>9</sub>, B-),
- (*v*<sub>0</sub>, *v*<sub>10</sub>, mat100, *v*<sub>11</sub>, Calculus I, *v*<sub>12</sub>, *v*<sub>13</sub>, st1, *v*<sub>14</sub>, Deere, *v*<sub>15</sub>, A),
- $(v_0, v_{10}, \text{mat100}, v_{11}, \text{Calculus I}, v_{12}, v_{16}, \text{st3}, v_{17}, \text{Smith}, v_{18}, \text{B+})$

Finally, we define the trees represented by a set of tuples *X* as the minimal, with respect to  $\leq$ , trees containing all tuples in *X*.

*Definition* 3.9 (*trees*<sub>*D*</sub>). Given a DTD *D* and a set of tree tuples  $X \subseteq \mathcal{T}(D)$ , *trees*<sub>*D*</sub>(*X*) is defined to be:

 $min_{\prec}$ { $T \mid T \lhd D$  and  $\forall t \in X$ ,  $tree_D(t) \preceq T$ }.

Notice that if  $T \in trees_D(X)$  and  $T' \equiv T$ , then T' is in  $trees_D(X)$ . The following shows that every XML document can be represented as a set of tree tuples, if we consider it as an unordered tree. That is, a tree T can be reconstructed from  $tuples_D(T)$ , up to equivalence  $\equiv$ .

THEOREM 3.10. Given a DTD D and an XML tree T, if  $T \triangleleft D$ , then  $trees_D(tuples_D([T])) = [T]$ .

**PROOF.** Every XML tree is finite, and, therefore,  $tuples_D([T]) = \{t_1, \ldots, t_n\}$ , for some *n*. Suppose that  $T \notin trees_D(\{t_1, \ldots, t_n\})$ . Given that  $tree_D(t_i) \leq T$ , for each  $i \in [1, n]$ , there is an XML tree *T*' such that  $T' \leq T$  and  $tree_D(t_i) \leq T'$ , for each  $i \in [1, n]$ . If  $T' \prec T$ , there is at least one node, string or attribute value contained in *T* which is not contained in *T'*. This value must be contained in some tree tuple  $t_j$  ( $j \in [1, n]$ ), which contradicts  $tree_D(t_j) \leq T'$ . Therefore,  $T \in trees_D(tuples_D([T]))$ .

Let  $T' \in trees_D(tuples_D([T]))$ . For each  $i \in [1, n]$ ,  $tree_D(t_i) \leq T'$ . Thus, given that  $tuples_D(T) = \{t_1, \ldots, t_n\}$ , we conclude that  $T \leq T'$ , and, therefore, by definition of  $trees_D$ ,  $T' \equiv T$ .  $\Box$ 

*Example* 3.11. It could be the case that for some set of tree tuples *X* there is no an XML tree *T* such that for every  $t \in X$ ,  $tree(t) \leq T$ . For example, let *D* be a DTD D = (E, A, P, R, r), where  $E = \{r, a, b\}$ ,  $A = \emptyset$ , P(r) = (a|b),  $P(a) = \epsilon$  and  $P(b) = \epsilon$ . Let  $t_1, t_2 \in \mathcal{T}(D)$  be defined as

| $t_1.r$                            | = | $V_0$   | $t_2.r$                                     | = | $V_2$   |
|------------------------------------|---|---------|---------------------------------------------|---|---------|
| <i>t</i> <sub>1</sub> . <i>r.a</i> | = | $V_1$   | <i>t</i> <sub>2</sub> . <i>r</i> . <i>a</i> | = | $\perp$ |
| $t_1.r.b$                          | = | $\perp$ | $t_2.r.b$                                   | = | $V_3$   |

Since  $t_1.r \neq t_2.r$ , there is no an XML tree *T* such that  $tree_D(t_1) \leq T$  and  $tree_D(t_2) \leq T$ .

We say that  $X \subseteq \mathcal{T}(D)$  is *D*-compatible if there is an XML tree *T* such that  $T \triangleleft D$  and  $X \subseteq tuples_D(T)$ . For a *D*-compatible set of tree tuples *X*, there is always an XML tree *T* such that for every  $t \in X$ ,  $tree_D(t) \preceq T$ . Moreover,

PROPOSITION 3.12. If  $X \subseteq \mathcal{T}(D)$  is *D*-compatible, then (a) There is an XML tree *T* such that  $T \triangleleft D$  and trees<sub>D</sub>(X) = [*T*], and (b)  $X \sqsubseteq^{\flat}$  tuples<sub>D</sub>(trees<sub>D</sub>(X)).

#### PROOF

(a) Assume that D = (E, A, P, R, r). Since X is *D*-compatible, there exists an XML tree T' = (V', lab', ele', att', root') such that  $T' \triangleleft D$  and  $X \subseteq tuples_D(T')$ . We use T' to define an XML tree T = (V, lab, ele, att, root) such that  $trees_D(X) = [T]$ .

For each  $v \in V'$ , if there is  $t \in X$  and  $p \in paths(D)$  such that t.p = v, then v is included in V. Furthermore, for each  $v \in V$ , lab(v) is defined as lab'(v),  $ele(v) = [s_1, \ldots, s_n]$ , where each  $s_i = t'.p.s$  or  $s_i = t'.p.\tau$  for some  $t' \in X$  and  $\tau \in E$  such that t'.p = v. For each  $@l \in A$  such that  $t'.p.@l \neq \bot$  and t'.p = v for some  $t' \in X$ , att(v, @l) is defined as t'.p.@l. Finally, *root* is defined as *root'*. It is easy to see that  $trees_D(X) = [T]$ .

(b) Let  $t \in X$  and T be an XML tree such that  $trees_D(X) = [T]$ . If  $t \in tuples_D([T])$ , then the property holds trivially. Suppose that  $t \notin tuples_D([T])$ . Then, given that  $tree_D(t) \leq T$ , there is  $t' \in tuples_D([T])$  such that  $t \sqsubset t'$ . In either case, we conclude that there is  $t' \in tuples_D(trees_D(X))$  such that  $t \sqsubseteq t'$ .  $\Box$ 

The example below shows that it could be the case that  $tuples_D(trees_D(X))$ properly dominates X, that is,  $X \equiv^{\flat} tuples_D(trees_D(X))$  and  $tuples_D(trees_D(X)) \not\equiv^{\flat} X$ . In particular, this example shows that the inverse of Theorem 3.10 does not hold, that is,  $tuples_D(trees_D(X))$  is not necessarily equal to X for every set of tree tuples X, even if this set is D-compatible. Let D be as in Example 3.11 and  $t_1, t_2 \in \mathcal{T}(D)$  be defined as

$$\begin{array}{rclrcrcrcrcrcrc} t_1.r &=& v_0 & t_2.r &=& v_0 \\ t_1.r.a &=& v_1 & t_2.r.a &=& \bot \\ t_1.r.b &=& \bot & t_2.r.b &=& v_2 \end{array}$$

Let  $t_3$  be a tree tuple defined as  $t_3.r = v_0$ ,  $t_3.r.a = v_1$  and  $t_3.r.b = v_2$ . Then,  $tuples_D(trees_D(\{t_1, t_2\})) = \{t_3\}$  since  $t_1 \sqsubset t_3$  and  $t_2 \sqsubset t_3$ , and, therefore,  $\{t_1, t_2\} \sqsubseteq^{\flat}$  $tuples_D(trees_D(\{t_1, t_2\}))$  and  $tuples_D(trees_D(\{t_1, t_2\})) \not\subseteq^{\flat} \{t_1, t_2\}$ .

From Theorem 3.10 and Proposition 3.12, it is straightforward to prove the following Corollary.

COROLLARY 3.13. For a D-compatible set of tree tuples X,  $trees_D(tuples_D(trees_D(X))) = trees_D(X)$ .

Theorem 3.10 and Proposition 3.12 are summarized in the diagram presented in the following figure. In this diagram, X is a *D*-compatible set of tree tuples. The arrow  $\frown$  stands for the  $\sqsubseteq^{\flat}$  ordering.



## 4. FUNCTIONAL DEPENDENCIES

We define functional dependencies for XML by using tree tuples. For a DTD D, a *functional dependency (FD)* over D is an expression of the form  $S_1 \rightarrow S_2$  where  $S_1$ ,  $S_2$  are finite nonempty subsets of *paths*(D). The set of all FDs over D is denoted by  $\mathcal{F}D(D)$ .

For  $S \subseteq paths(D)$ , and  $t, t' \in \mathcal{T}(D)$ , t.S = t'.S means t.p = t'.p for all  $p \in S$ . Furthermore,  $t.S \neq \bot$  means  $t.p \neq \bot$  for all  $p \in S$ . If  $S_1 \rightarrow S_2 \in \mathcal{F}D(D)$  and T is an XML tree such that  $T \triangleleft D$  and  $S_1 \cup S_2 \subseteq paths(T)$ , we say that T satisfies  $S_1 \rightarrow S_2$  (written  $T \models S_1 \rightarrow S_2$ ) if for every  $t_1, t_2 \in tuples_D(T), t_1.S_1 = t_2.S_1$  and  $t_1.S_1 \neq \bot$  imply  $t_1.S_2 = t_2.S_2$ . We observe that if tree tuples  $t_1, t_2$  satisfy an FD  $S_1 \rightarrow S_2$ , then for every path  $p \in S_2, t_1.p$  and  $t_2.p$  are either both null or both nonnull. Moreover, if for every pair of tree tuples  $t_1, t_2$  in an XML tree  $T, t_1.S_1 = t_2.S_1$  implies they have a null value on some  $p \in S_1$ , then the FD is trivially satisfied by T.

The previous definition extends to equivalence classes, since for any FD  $\varphi$ , and  $T \equiv T'$ ,  $T \models \varphi$  iff  $T' \models \varphi$ . We write  $T \models \Sigma$ , for  $\Sigma \subseteq \mathcal{F}D(D)$ , if  $T \models \varphi$  for each  $\varphi \in \Sigma$ , and we write  $T \models (D, \Sigma)$ , if  $T \models D$  and  $T \models \Sigma$ .

*Example* 4.1. Referring back to Example 1.1, we have the following FDs. cno is a key of course:

*courses.course.@cno* 
$$\rightarrow$$
 *courses.course.* (FD1)

Another FD says that two distinct student subelements of the same course cannot have the same sno:

{*courses.course, courses.course.taken\_by.student.@sno*}  $\rightarrow$ 

courses.course.taken\_by.student. (FD2)

Finally, to say that two student elements with the same sno value must have the same name, we use

courses.course.taken\_by.student.@sno  $\rightarrow$ 

courses.course.taken\_by.student.name.S. (FD3)

We offer a few remarks on our definition of FDs. First, using the tree tuples representation, it is easy to combine node and value equality: the former corresponds to equality between vertices and the latter to equality between strings. Moreover, keys naturally appear as a subclass of FDs, and relative constraints can also be encoded. Note that by defining the semantics of  $\mathcal{F}D(D)$  on  $\mathcal{T}(D)$ , we essentially define satisfaction of FDs on relations with null values, and our semantics is the standard semantics used in Atzeni and Morfuni [1984] and Levene and Loizou [1998].

Given a DTD *D*, a set  $\Sigma \subseteq \mathcal{F}D(D)$  and  $\varphi \in \mathcal{F}D(D)$ , we say that  $(D, \Sigma)$ *implies*  $\varphi$ , written  $(D, \Sigma) \vdash \varphi$ , if for any tree *T* with  $T \models D$  and  $T \models \Sigma$ , it is the case that  $T \models \varphi$ . The set of all FDs implied by  $(D, \Sigma)$  will be denoted by  $(D, \Sigma)^+$ . Furthermore, an FD  $\varphi$  is *trivial* if  $(D, \emptyset) \vdash \varphi$ . In relational databases, the only trivial FDs are  $X \to Y$ , with  $Y \subseteq X$ . Here, DTD forces some more interesting trivial FDs. For instance, for each  $p \in EPaths(D)$  and p' a prefix of p,  $(D, \emptyset) \vdash p \to p'$ , and for every p,  $p.@l \in paths(D)$ ,  $(D, \emptyset) \vdash p \to p.@l$ . As a matter of fact, trivial functional dependencies in XML documents can be much more complicated than in the relational case, as we show in the following example.

*Example* 4.2. Let D = (E, A, P, R, r) be a DTD. Assume that a, b and c are element types in D and P(r) = (a|b|c). Then, for every  $p \in paths(D)$ ,  $\{r.a, r.b\} \rightarrow p$  is a trivial FD since for every XML tree T conforming to D and every tree tuple t in T,  $t.r.a = \bot$  or  $t.r.b = \bot$ .

# 5. XNF: AN XML NORMAL FORM

With the definitions of the previous section, we are ready to present the normal form that generalizes BCNF for XML documents.

Definition 5.1. Given a DTD D and  $\Sigma \subseteq \mathcal{F}D(D)$ ,  $(D, \Sigma)$  is in XML normal form (XNF) iff for every nontrivial FD  $\varphi \in (D, \Sigma)^+$  of the form  $S \to p.@l$  or  $S \to p.S$ , it is the case that  $S \to p$  is in  $(D, \Sigma)^+$ .

The intuition is as follows. Suppose that  $S \to p.@l$  is in  $(D, \Sigma)^+$ . If *T* is an XML tree conforming to *D* and satisfying  $\Sigma$ , then in *T* for every set of values of the elements in *S*, we can find only one value of p.@l. Thus, for every set of values of *S* we need to store the value of p.@l only once; in other words,  $S \to p$  must be implied by  $(D, \Sigma)$ .

In this definition, we impose the condition that  $\varphi$  is a nontrivial FD. Indeed, the trivial FD  $p.@l \rightarrow p.@l$  is always in  $(D, \Sigma)^+$ , but often  $p.@l \rightarrow p \notin (D, \Sigma)^+$ , which does not necessarily represent a bad design.

To show how XNF distinguishes good XML design from bad design, we revisit the examples from the introduction, and prove that XNF generalizes BCNF and

NNF, a normal form for nested relations [Mok et al. 1996; Özsoyoglu and Yuan 1987], when only functional dependencies are provided.

*Example* 5.2. Consider the DTD from Example 1.1 whose FDs are (FD1), (1), (1) shown in the previous section. (1) associates a unique name with each student number, which is therefore redundant. The design is *not* in XNF, since it contains (1) but does not imply the functional dependency

courses.course.taken\_by.student.@sno  $\rightarrow$  courses.course.taken\_by.student.name.

To remedy this, we gave a revised DTD in Example 1.1. The idea was to create a new element info for storing information about students. That design satisfies FDs (FD1), (1) as well as

*courses.info.number.@sno*  $\rightarrow$  *courses.info*,

and can be easily verified to be in XNF.

*Example* 5.3. Suppose that *D* is the DBLP DTD from Example 1.2. Among the set  $\Sigma$  of FDs satisfied by the documents are:

| $db.conf.title.S \rightarrow db.conf$ | (FD4) |
|---------------------------------------|-------|
|---------------------------------------|-------|

 $db.conf.issue \rightarrow db.conf.issue.inproceedings.@year$  (FD5)

 $\{db.conf.issue, db.conf.issue.inproceedings.title.S\} \rightarrow$ 

*db.conf.issue.inproceedings* (FD6)

 $db.conf.issue.inproceedings.@key \rightarrow db.conf.issue.inproceedings$  (FD7)

Constraint (FD4) enforces that two distinct conferences have distinct titles. Given that an issue of a conference represents a particular year of the conference, constraint (FD5) enforces that two articles of the same issue must have the same value in the attribute year. Constraint (FD6) enforces that for a given issue of a conference, two distinct articles must have different titles. Finally, constraint (FD7) enforces that key is an identifier for each article in the database.

By (FD5), for each issue of a conference, its year is stored in every article in that issue and, thus, DBLP documents can store redundant information. (D,  $\Sigma$ ) is not in XNF, since

 $db.conf.issue \rightarrow db.conf.issue.inproceedings$ 

is not in  $(D, \Sigma)^+$ .

The solution we proposed in the introduction was to make year an attribute of issue. (FD5) is not valid in the revised specification, which can be easily verified to be in XNF. Note that we do not replace (FD5) by *db.conf.issue*  $\rightarrow$  *db.conf.issue.@year*, since it is a trivial FD and thus is implied by the new DTD alone.

## 5.1 BCNF and XNF

Relational databases can be easily mapped into XML documents. Given a relation  $G(A_1, \ldots, A_n)$  and a set of FDs *FD* over *G*, we translate the schema (*G*, *FD*)

into an XML representation, that is, a DTD and a set of XML FDs ( $D_G$ ,  $\Sigma_{FD}$ ). The DTD  $D_G = (E, A, P, R, db)$  is defined as follows:

 $-E = \{db, G\}.$  $-A = \{@A_1, \dots, @A_n\}.$  $-P(db) = G^* \text{ and } P(G) = \epsilon.$  $-R(db) = \emptyset, R(G) = \{@A_1, \dots, @A_n\}.$ 

Without loss of generality, assume that all FDs are of the form  $X \to A$ , where A is an attribute. Then  $\Sigma_{FD}$  over  $D_G$  is defined as follows.

 $-\text{For each FD } A_{i_1} \cdots A_{i_m} \to A_i \in FD, \ \{db.G.@A_{i_1}, \dots, db.G.@A_{i_m}\} \to db.G.$ 

The latter is included to avoid duplicates.

*Example* 5.4. A schema *G*(*A*, *B*, *C*) can be coded by the following DTD:

```
<!ELEMENT db (G*)>
<!ELEMENT G EMPTY>
<!ATTLIST G
A CDATA #REQUIRED
B CDATA #REQUIRED
C CDATA #REQUIRED>
```

In this schema, an FD  $A \rightarrow B$  is translated into  $db.G.@A \rightarrow db.G.@B$ .

The following proposition shows that BCNF and XNF are equivalent when relational databases are appropriately coded as XML documents.

**PROPOSITION 5.5.** Given a relation schema  $G(A_1, ..., A_n)$  and a set of functional dependencies FD over G, (G, FD) is in BCNF iff  $(D_G, \Sigma_{FD})$  is in XNF.

PROOF. This follows from Proposition 5.7 (to be proved in the next section) since every relation schema is trivially consistent (see next section) and NNF-FD coincides with BCNF when only functional dependencies are provided [Mok et al. 1996]. □

## 5.2 NNF and XNF

A nested relation schema is either a set of attributes X, or  $X(G_1)^* \cdots (G_n)^*$ , where  $G_i$ 's are nested relation schemas. An example of a nested relation for the schema  $H_1 = Country(H_2)^*$ ,  $H_2 = State(H_3)^*$ ,  $H_3 = City$  is shown in Figure 3(a).

Nested schemas are naturally mapped into DTDs, as they are defined by means of regular expressions. For a nested schema  $G = X(G_1)^* \cdots (G_n)^*$ , we introduce an element type G with  $P(G) = G_1^*, \ldots, G_n^*$  and  $R(G) = \{@A_1, \ldots, @A_m\}$ , where  $X = \{A_1, \ldots, A_m\}$ ; at the top level we have a new



| Country       | State | City      |
|---------------|-------|-----------|
| United States | Texas | Houston   |
| United States | Texas | Dallas    |
| United States | Ohio  | Columbus  |
| United States | Ohio  | Cleveland |

(a) Nested relation  $H_1$ 

(b) Complete unnesting of  $H_1$ 

Fig. 3. Nested relation and its unnesting.

element type *db* with  $P(db) = G^*$  and  $R(db) = \emptyset$ . In our example the DTD is:

```
<!DOCTYPE db [
  <!ELEMENT db (H1*)>
  <!ELEMENT H1 (H2*)>
    <!ATTLIST H1 Country CDATA #REQUIRED>
  <!ELEMENT H2 (H3*)>
    <!ATTLIST H2 State CDATA #REQUIRED>
  <!ELEMENT H3 EMPTY>
    <!ATTLIST H3 City CDATA #REQUIRED>
]>
```

7、

The definition of FDs for nested relations uses the notion of complete unnesting. The complete unnesting of a nested relation from our example is shown in Figure 3(b); in general, this notion is easily defined by induction. In our example, we have a valid FD *State*  $\rightarrow$  *Country*, while the FD *State*  $\rightarrow$  *City* does not hold.

Normalization is usually considered for nested relations in the *partition nor*mal form (PNF) [Abiteboul et al. 1995; Mok et al. 1996; Özsoyoglu and Yuan 1987]. A nested relation r over  $X(G_1)^* \cdots (G_n)^*$  is in PNF if for any two tuples  $t_1$ ,  $t_2$  in r: (1) if  $t_1.X = t_2.X$ , then the nested relation  $t_1.G_i$  and  $t_2.G_i$  are equal, for every  $i \in [1, n]$ , and (2) each nested relation  $t_1.G_i$  is in PNF, for every  $i \in [1, n]$ . Note that PNF can be enforced by using FDs on the XML representation. In our example this is done as follows:

 $\begin{aligned} db.H_1.@Country \rightarrow db.H_1\\ \{db.H_1, db.H_1.H_2.@State\} \rightarrow db.H_1.H_2\\ \{db.H_1.H_2, db.H_1.H_2.H_3.@City\} \rightarrow db.H_1.H_2.H_3.\end{aligned}$ 

It turns out that one can define FDs over nested relations by using the XML representation. Let U be a set of attributes,  $G_1$  a nested relation schema over U and FD a set of functional dependencies over  $G_1$ . Assume that  $G_1$  includes nested relation schemas  $G_2, \ldots, G_n$  and a set of attributes  $U' \subseteq U$ . For each  $G_i$  ( $i \in [1, n]$ ),

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Fig. 4. Two schema trees.

 $path(G_i)$  is inductively defined as follows. If  $G_i = G_1$ , then  $path(G_i) = db.G_1$ . Otherwise, if  $G_i$  is a nested attribute of  $G_j$ , then  $path(G_i) = path(G_j).G_i$ . Furthermore, if  $A \in U'$  is an atomic attribute of  $G_i$ , then  $path(A) = path(G_i).@A$ . For instance, for the schema of the nested relation in Figure 3,  $path(H_2) = db.H_1.H_2$  and  $path(City) = db.H_1.H_2.H_3.@City$ .

We now define  $\Sigma_{FD}$  as follows:

- -For each FD  $A_{i_1} \cdots A_{i_m} \rightarrow A_i \in FD$ ,  $\{path(A_{i_1}), \dots, path(A_{i_m})\} \rightarrow path(A_i)$  is in  $\Sigma_{FD}$ .
- −For each  $i \in [1, n]$ , if  $A_{j_1}, \ldots, A_{j_m}$  is the set of atomic attributes of  $G_i$  and  $G_i$  is a nested attribute of  $G_j$ , {*path*( $G_j$ ), *path*( $A_{j_1}$ ), ..., *path*( $A_{j_m}$ )} → *path*( $G_i$ ) is in  $\Sigma_{FD}$ .

Furthermore, if  $B_{j_1}, \ldots, B_{j_l}$  is the set of atomic attributes of  $G_1$ , then  $\{path(B_{j_1}), \ldots, path(B_{j_l})\} \rightarrow path(G_1)$  is in  $\Sigma_{FD}$ .

Note that the last rule imposes the partition normal form. The set  $\Sigma_{PNF}$  contains all the functional dependencies defined by this rule.

A normal form for nested relations called NNF was first introduced in Özsoyoglu and Yuan [1987], and then revisited in Mok et al. [1996]. These normal forms were defined for nested schemas containing functional and multivalued dependencies. Here we consider a normal form NNF-FD, which is the nested normal form NNF introduced in Mok et al. [1996] restricted to FDs only. To define this normal form, we need to introduce some terminology.

Every nested relation schema *G* can be represented as a tree st(G), called the *schema tree of G*. Formally, if *G* is a flat schema containing a set of attributes *X*, then st(G) is a single node tree whose root is the set of attributes *X*. Otherwise, *G* is of the form  $X(G_1)^* \cdots (G_n)^*$  and st(G) is a tree defined as follows: The root of st(G) is *X* and the children of *X* are the roots of  $st(G_1), \ldots, st(G_n)$ . For example, the schema trees of nested relation schemas  $G_1 = Title(G_2)^*(G_3)^*$ ,  $G_2 = Director, G_3 = Theater(G_4)^*, G_4 = Snack$  and  $H_1 = Country(H_2)^*, H_2 = State(H_3)^*, H_3 = City$  are shown in Figures 4(a) and 4(b), respectively. Given a nested relation schema *G* including a set of attributes in all ancestors of *X* in st(G), including *X*. For instance, *ancestor(State)* = {*Country, State*} in the schema tree shown in Figure 4(b). Similarly, for every  $A \in U$ , we define *ancestor(A)* as the set of attributes *ancestor(X\_A)*, where  $X_A$  is the one of st(G) containing the attribute *A*, and for every node *X* of st(G) we define

descendant(X) as the union of attributes in all descendants of X in st(G), including X.

Data dependencies for nested relations are defined by using the notion of complete unnesting. Thus, every nested schema has some multivalued dependencies. For example, the nested relation schema  $G_1 = Title(G_2)^*(G_3)^*$ ,  $G_2 = Director$ ,  $G_3 = Theater(G_4)^*$ ,  $G_4 = Snack$  has the following set of multivalued dependencies:

{*Title*  $\rightarrow \rightarrow$  *Director*, *Title*  $\rightarrow \rightarrow$  {*Theater*, *Snack*}, {*Title*, *Theater*}  $\rightarrow \rightarrow$  *Snack*},

since for every nested relation I of  $G_1$ , the complete unnesting of I satisfies these dependencies. Formally, the set of multivalued dependencies embedded in a nested relation schema G is defined to be:

 $MVD(G) = \{ancestor(X) \rightarrow descendant(Y) \mid (X, Y) \text{ is an edge in } st(G) \}.$ 

Given a nested relation schema *G*, the set MVD(G) is used to define NNF and, in particular, to define NNF-FD. More precisely, if  $\Sigma$  is a set of functional and multivalued dependencies over *G*, then  $(G, \Sigma)$  is in NNF [Mok et al. 1996] if (1)  $\Sigma$  is equivalent to  $MVD(G) \cup \{X \rightarrow Y \mid X \rightarrow Y \in (G, \Sigma)^+\}$ , and (2) for each nontrivial FD  $X \rightarrow A \in (G, \Sigma)^+$ ,  $X \rightarrow ancestor(A)$  is also in  $(G, \Sigma)^+$ . As before,  $(G, \Sigma)^+$  stands for the set of all FDs implied by  $(G, \Sigma)$ . Furthermore, if *FD* is a set of functional dependencies over *G*, then (G, FD) is in NNF-FD if (1)  $FD \vdash MVD(G)$ , that is, every multivalued dependency embedded in *G* is implied by *FD*, and (2) for each nontrivial FD  $X \rightarrow A \in (G, FD)^+$ ,  $X \rightarrow ancestor(A)$  is also in  $(G, FD)^+$ .

*Example* 5.6. We show here that in general XNF does not generalize NNF since it does not consider multivalued dependencies. Let *G* be the nested schema shown in Figure 4(a) and assume that  $\Sigma$  contains the following multivalued dependencies:

 $\begin{array}{rcccc} \textit{Title} & \longrightarrow & \textit{Director}, & \textit{Title} & \longrightarrow & \textit{Theater}, \\ \textit{Title} & \longrightarrow & \textit{Snack}. \end{array}$ 

Then  $(G, \Sigma)$  is not in NNF since the set of multivalued dependencies  $MVD(G) = {Title \rightarrow Director}$  is not equivalent to  $\Sigma$ . On the other hand, the XML representation of  $(G, \Sigma)$  is trivially in XNF since  $\Sigma$  does not contain any functional dependency.

To establish the relationship between NNF-FD and XNF, we have to introduce the notion of consistent nested schemas. Given a nested relation schema G and a set of FDs FD over G, (G, FD) is *consistent* [Mok et al. 1996] if  $FD \vdash MVD(G)$ . It was shown in Mok et al. [1996] that for consistent nested schemas, NNF precisely characterize redundancy in nested relations. The result below shows that for consistent nested schemas, NNF-FD and XNF coincide.

PROPOSITION 5.7. Let G be a nested relation schema and FD a set of functional dependencies over G such that (G, FD) is consistent. Then (G, FD) is in NNF-FD iff ( $D_G$ ,  $\Sigma_{FD}$ ) is in XNF.

**PROOF.** First, we need to prove the following claim.

CLAIM 5.8.  $A_{i_1} \cdots A_{i_m} \rightarrow A_i \in (G, FD)^+$  if and only if  $\{path(A_{i_1}), \ldots, path(A_{i_m})\} \rightarrow path(A_i) \in (D_G, \Sigma_{FD})^+$ .

The proof of this claim follows from the following fact: For each instance I of G, there is an XML tree  $T_I$  conforming to  $D_G$  such that  $I \models FD$  iff  $T_I \models \Sigma_{FD}$ . Moreover, for each XML tree T conforming to  $D_G$  and satisfying  $\Sigma_{PNF}$ , there is an instance  $I_T$  of G such that  $T \models \Sigma_{FD}$  iff  $I_T \models FD$ .

Now we prove the proposition.

( $\Leftarrow$ ) Suppose that  $(D_G, \Sigma_{FD})$  is in XNF. We prove that (G, FD) is in NNF-FD. Given that (G, FD) is consistent, we only need to consider the second condition in the definition of NNF-FD. Let  $A_{i_1} \cdots A_{i_m} \to A_i$  be a nontrivial functional dependency in  $(G, FD)^+$ . We have to prove that  $A_{i_1} \cdots A_{i_m} \to ancestor(A_i)$  is in  $(G, FD)^+$ . By Claim 5.8, we know that  $\{path(A_{i_1}), \ldots, path(A_{i_m})\} \to path(A_i)$  is a nontrivial functional dependency in  $(D_G, \Sigma_{FD})^+$ . Since  $(D_G, \Sigma_{FD})$  is in XNF,  $\{path(A_{i_1}), \ldots, path(A_{i_m})\} \to path(G_j)$  is in  $(D_G, \Sigma_{FD})^+$ , where  $G_j$  is a nested relation schema contained in G such that  $A_i$  is an atomic attribute of  $G_j$ . Thus, given that  $path(G_j) \to path(A)$  is a trivial functional dependency in  $D_G$ , for each  $A \in ancestor(A_i)$ , we conclude that  $\{path(A_{i_1}), \ldots, path(A_{i_m})\} \to path(A)$  is in  $(D_G, \Sigma_{FD})^+$  for each  $A \in ancestor(A_i)$ . By Claim 5.8,  $A_{i_1} \cdots A_{i_m} \to ancestor(A_i)$ is in  $(G, FD)^+$ .

 $(\Rightarrow)$  Suppose that (G, FD) is in NNF-FD. We will prove that  $(D_G, \Sigma_{FD})$  is in XNF. Let R be a nested relation schema contained in G and A an atomic attribute of R. Suppose that there is  $S \subseteq paths(D_G)$  such that  $S \rightarrow path(A)$ is a nontrivial functional dependency in  $(D_G, \Sigma_{FD})^+$ . We have to prove that  $S \rightarrow path(R) \in (D_G, \Sigma_{FD})^+$ . Let  $S_1$  and  $S_2$  be set of paths such that S = $S_1 \cup S_2$ ,  $S_1 \subseteq EPaths(D_G)$  and  $S_2 \cap EPaths(D_G) = \emptyset$ . Let  $S'_1 = \{path(A') \mid \text{there}\}$ is  $path(R') \in S_1$  such that A' is an atomic attribute of some nested relation schema mentioned in *path*(R'). Given that  $\Sigma_{PNF} \subseteq \Sigma_{FD}$ ,  $S'_1 \rightarrow S_1 \in (D_G, \Sigma_{FD})^+$ . Thus,  $S'_1 \cup S_2 \rightarrow path(A) \in (D_G, \Sigma_{FD})^+$ . Assume that  $S'_1 \cup S_2 = \{path(A_{i_1}), \ldots, p_{i_1}\}$ *path*( $A_{i_m}$ )}. By Claim 5.8,  $A_{i_1} \cdots A_{i_m} \rightarrow A$  is a nontrivial functional dependency in  $(G, FD)^+$ . Thus, given that (G, FD) is in NNF-FD, we conclude that  $A_{i_1}$ ...  $A_{i_m} \rightarrow ancestor(A)$  is in  $(G, FD)^+$ . Therefore, by Claim 5.8,  $S'_1 \cup S_2 \rightarrow path(B)$ is in  $(D_G, \Sigma_{FD})^+$ , for each  $B \in ancestor(A)$ . But  $\{path(B) \mid B \in ancestor(A)\}$  $\rightarrow$  path(R) is in  $(D_G, \Sigma_{FD})^+$ , since  $\Sigma_{PNF} \subseteq \Sigma_{FD}$ . Thus,  $S'_1 \cup S_2 \rightarrow path(R) \in$  $(D_G, \Sigma_{FD})^+$ , and given that  $S_1 \to S'_1$  is a trivial functional dependency in  $D_G$ , we conclude that  $S \rightarrow path(R)$  is in  $(D_G, \Sigma_{FD})^+$ .  $\square$ 

#### 6. NORMALIZATION ALGORITHMS

The goal of this section is to show how to transform a DTD D and a set of FDs  $\Sigma$  into a new specification (D',  $\Sigma'$ ) that is in XNF and contains the same information.

Throughout the section, we assume that the DTDs are nonrecursive. This can be done without any loss of generality. Notice that in a recursive DTD D, the set of all paths is infinite. However, a given set of FDs  $\Sigma$  only mentions a

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finite number of paths, which means that it suffices to restrict one's attention to a finite number of "unfoldings" of recursive rules.

We make an additional assumption that all the FDs are of the form:  $\{q, p_1.@l_1, \ldots, p_n.@l_n\} \rightarrow p$ . That is, they contain at most one element path on the left-hand side. Note that all the FDs we have seen so far are of this form. While constraints of the form  $\{q, q', \ldots\}$  are not forbidden, they appear to be quite unnatural (in fact it is very hard to come up with a reasonable example where they could be used). Furthermore, even if we have such constraints, they can be easily eliminated. To do so, we create a new attribute @l, remove  $\{q, q'\} \cup S \rightarrow p$  and replace it by  $q'.@l \rightarrow q'$  and  $\{q, q'.@l\} \cup S \rightarrow p$ .

We shall also assume that paths do not contain the symbol S (since p.S can always be replaced by a path of the form p.@l).

## 6.1 The Decomposition Algorithm

For presenting the algorithm and proving its losslessness, we make the following assumption: if  $X \to p.@l$  is an FD that causes a violation of XNF, then every time that p.@l is not null, every path in X is not null. This will make our presentation simpler, and then at the end of the section we will show how to eliminate this assumption.

Given a DTD *D* and a set of FDs  $\Sigma$ , a nontrivial FD  $S \to p.@l$  is called *anomalous*, over  $(D, \Sigma)$ , if it violates XNF; that is,  $S \to p.@l \in (D, \Sigma)^+$  but  $S \to p \notin (D, \Sigma)^+$ . A path on the right-hand side of an anomalous FD is called an anomalous path, and the set of all such paths is denoted by  $AP(D, \Sigma)$ .

In this section we present an XNF decomposition algorithm that combines two basic ideas presented in the introduction: creating a new element type, and moving an attribute.

6.1.1 *Moving Attributes.* Let D = (E, A, P, R, r) be a DTD and  $\Sigma$  a set of FDs over *D*. Assume that  $(D, \Sigma)$  contains an anomalous FD  $q \rightarrow p.@l$ , where  $q \in EPaths(D)$ . For example, the DBLP database shown in Example 1.2 contains an anomalous FD of this form:

$$db.conf.issue \rightarrow db.conf.issue.inproceedings.@year.$$
 (1)

To eliminate the anomalous FD, we move the attribute @l from the set of attributes of the last element of p to the set of attributes of the last element of q, as shown in the following figure.



For instance, to eliminate the anomalous functional dependency (1) we move the attribute @year from the set of attributes of *inproceedings* to the set of

attributes of *issue*. Formally, the new DTD D[p.@l := q.@m], where @m is an attribute, is defined to be (E, A', P, R', r), where  $A' = A \cup \{@m\}, R'(last(q)) = R(last(q)) \cup \{@m\}, R'(last(p)) = R(last(p)) - \{@l\}$  and  $R'(\tau') = R(\tau')$  for each  $\tau' \in E - \{last(q), last(p)\}$ .

After transforming *D* into a new DTD D[p.@l := q.@m], a new set of functional dependencies is generated. Formally, the set of FDs  $\Sigma[p.@l := q.@m]$  over D[p.@l := q.@m] consists of all FDs  $S_1 \rightarrow S_2 \in (D, \Sigma)^+$  with  $S_1 \cup S_2 \subseteq paths(D[p.@l := q.@m])$ . Observe that the new set of FDs does not include the functional dependency  $q \rightarrow p.@l$  and, thus, it contains a smaller number of anomalous paths, as we show in the following proposition.

PROPOSITION 6.1. Let *D* be a DTD,  $\Sigma$  a set of *FDs* over *D*,  $q \rightarrow p.@l$  an anomalous *FD*, with  $q \in EPaths(D)$ , D' = D[p.@l := q.@m], where @m is not an attribute of last(q), and  $\Sigma' = \Sigma[p.@l := q.@m]$ . Then  $AP(D', \Sigma') \subsetneq AP(D, \Sigma)$ .

PROOF. First, we prove (by contradiction) that  $q.@m \notin AP(D', \Sigma')$ . Suppose that  $S' \subseteq paths(D)$  and  $S' \to q.@m \in (D', \Sigma')^+$  is a nontrivial functional dependency. Assume that  $S' \to q \notin (D', \Sigma')^+$ . Then there is an XML tree T' such that  $T' \models (D', \Sigma')$  and T' contains tree tuples  $t_1, t_2$  such that  $t_1.S' = t_2.S'$ ,  $t_1.S' \neq \bot$  and  $t_1.q \neq t_2.q$ . Given that there is no a constraint in  $\Sigma'$  including the path q.@m, the XML tree T'' constructed from T' by giving two distinct values to  $t_1.q.@m$  and  $t_2.q.@m$  conforms to D', satisfies  $\Sigma'$  and does not satisfy  $S' \to q.@m$ , a contradiction. Hence,  $q.@m \notin AP(D', \Sigma')$ .

Second, we prove that for every  $S_1 \cup S_2 \subseteq paths(D') - \{q.@m\}, (D, \Sigma) \vdash S_1 \rightarrow S_2$  if and only if  $(D', \Sigma') \vdash S_1 \rightarrow S_2$ , and, thus, by considering the previous paragraph we conclude that  $AP(D', \Sigma') \subseteq AP(D, \Sigma)$ . Let  $S_1 \cup S_2 \subseteq paths(D') - \{q.@m\}$ . By definition of  $\Sigma'$ , we know that if  $(D, \Sigma) \vdash S_1 \rightarrow S_2$ , then  $(D', \Sigma') \vdash S_1 \rightarrow S_2$  and, therefore, we only need to prove the other direction. Assume that  $(D, \Sigma) \nvDash S_1 \rightarrow S_2$ . Then there exists an XML tree *T* such that  $T \models (D, \Sigma)$  and  $T \nvDash S_1 \rightarrow S_2$ . Define an XML tree *T'* from *T* by assigning arbitrary values to q.@m and removing the attribute @l from last(p). Then  $T' \models (D', \Sigma')$  and  $T' \nvDash S_1 \rightarrow S_2$ , since all the paths mentioned in  $\Sigma' \cup \{S_1 \rightarrow S_2\}$  are included in  $paths(D') - \{q.@m\}$ . Thus,  $(D', \Sigma') \nvDash S_1 \rightarrow S_2$ .

To conclude the proof, we note that  $p.@l \in AP(D, \Sigma)$  and  $p.@l \notin AP(D', \Sigma')$ , since  $p.@l \notin paths(D')$ . Therefore,  $AP(D', \Sigma') \subsetneq AP(D, \Sigma)$ .  $\Box$ 

6.1.2 *Creating New Element Types.* Let D = (E, A, P, R, r) be a DTD and  $\Sigma$  a set of FDs over D. Assume that  $(D, \Sigma)$  contains an anomalous FD  $\{q, p_1.@l_1, \ldots, p_n.@l_n\} \rightarrow p.@l$ , where  $q \in EPaths(D)$  and  $n \ge 1$ . For example, the university database shown in Example 1.1 contains an anomalous FD of this form (considering *name*.S as an attribute of *student*):

{*courses, course.taken\_by.student.@sno*}  $\rightarrow$ 

courses.course.taken\_by.student.name.S. (2)

To eliminate the anomalous FD, we create a new element type  $\tau$  as a child of the last element of q, we make  $\tau_1, \ldots, \tau_n$  its children, where  $\tau_1, \ldots, \tau_n$  are new

element types, we remove @*l* from the list of attributes of *last*(*p*) and we make it an attribute of  $\tau$  and we make @*l*<sub>1</sub>, ..., @*l*<sub>n</sub> attributes of  $\tau_1, \ldots, \tau_n$ , respectively, but without removing them from the sets of attributes of *last*(*p*<sub>1</sub>), ..., *last*(*p*<sub>n</sub>), as shown in the following figure:



For instance, to eliminate the anomalous functional dependency (2), in Example 1.1, we create a new element type *info* as a child of *courses*, we remove *name*.S from *student* and we make it an "attribute" of *info*, we create an element type *number* as a child of *info* and we make *@sno* its attribute. We note that we do not remove *@sno* as an attribute of *student*. Formally, if  $\tau$ ,  $\tau_1, \ldots, \tau_n$  are element types that are not in *E*, the new DTD, denoted by  $D[p.@l := q.\tau[\tau_1.@l_1, \ldots, \tau_n.@l_n, @l]]$ , is (E', A, P', R', r), where  $E' = E \cup \{\tau, \tau_1, \ldots, \tau_n\}$  and

- (1) if P(last(q)) is a regular expression *s*, then P'(last(q)) is defined as the concatenation of *s* and  $\tau^*$ , that is  $(s, \tau^*)$ . Furthermore,  $P'(\tau)$  is defined as the concatenation of  $\tau_1^*, \ldots, \tau_n^*, P'(\tau_i) = \epsilon$ , for each  $i \in [1, n]$ , and  $P'(\tau') = P(\tau')$ , for each  $\tau' \in E \{last(q)\}$ .
- (2)  $R'(\tau) = \{@l\}, R'(\tau_i) = \{@l_i\}, \text{ for each } i \in [1, n], R'(last(p)) = R(last(p)) \{@l\}$ and  $R'(\tau') = R(\tau')$  for each  $\tau' \in E - \{last(p)\}.$

After transforming *D* into a new DTD  $D' = D[p.@l := q.\tau[\tau_1.@l_1, ..., \tau_n.@l_n, @l]]$ , a new set of functional dependencies is generated. Formally,  $\Sigma[p.@l := q.\tau[\tau_1.@l_1, ..., \tau_n.@l_n, @l]]$  is a set of FDs over *D* defined as the union of the sets of constraints defined in (1), (2) and (3):

- (1)  $S_1 \to S_2 \in (D, \Sigma)^+$  with  $S_1 \cup S_2 \subseteq paths(D)$ .
- (2) Each FD over q,  $p_i$ ,  $p_i.@l_i$  ( $i \in [1, n]$ ) and p.@l is transferred to  $\tau$  and its children. That is, if  $S_1 \cup S_2 \subseteq \{q, p_1, \ldots, p_n, p_1.@l_1, \ldots, p_n.@l_n, p.@l\}$  and

 $S_1 \rightarrow S_2 \in (D, \Sigma)^+$ , then we include an FD obtained from  $S_1 \rightarrow S_2$  by changing  $p_i$  to  $q.\tau.\tau_i$ ,  $p_i.@l_i$  to  $q.\tau.\tau_i.@l_i$ , and p.@l to  $q.\tau.@l$ .

(3)  $\{q, q.\tau.\tau_1.@l_1, \ldots, q.\tau.\tau_n.@l_n\} \rightarrow q.\tau$ , and  $\{q.\tau, q.\tau.\tau_i.@l_i\} \rightarrow q.\tau.\tau_i$  for  $i \in [1, n].^1$ 

We are not interested in applying this transformation to an arbitrary anomalous FD, but rather to a *minimal* one. To understand the notion of minimality for XML FDs, we first introduce this notion for relational databases. Let R be a relation schema containing a set of attributes U and  $\Sigma$  be a set of FDs over R. If  $(R, \Sigma)$  is not in BCNF, then there exist pairwise disjoint sets of attributes X, Y and Z such that  $U = X \cup Y \cup Z, \Sigma \vdash X \rightarrow Y$  and  $\Sigma \nvDash X \rightarrow A$ , for every  $A \in Z$ . In this case, we say that  $X \rightarrow Y$  is an anomalous FD. To eliminate this anomaly, a decomposition algorithm splits relation R into two relations: S(X, Y) and T(X, Z). A desirable property of the new schema is that S or Tis in BCNF. We say that  $X \rightarrow Y$  is a minimal anomalous FD if S(X, Y) is in BCNF, that is, S(X, Y) does not contain an anomalous FD. This condition can be defined as follows:  $X \rightarrow Y$  is *minimal* if there are no pairwise disjoint sets  $X', Y' \subseteq U$  such that  $X' \cup Y' \subsetneqq X \cup Y, \Sigma \vdash X' \rightarrow Y'$  and  $\Sigma \nvDash X' \rightarrow X \cup Y$ .

In the XML context, the definition of minimality is similar in the sense that we expect the new element types  $\tau$ ,  $\tau_1, \ldots, \tau_n$  form a structure not containing anomalous elements. However, the definition of minimality is more complex to account for paths used in FDs. We say that  $\{q, p_1.@l_1, \ldots, p_n.@l_n\} \rightarrow p_0.@l_0$ is  $(D, \Sigma)$ -minimal if there is no anomalous FD  $S' \rightarrow p_i.@l_i \in (D, \Sigma)^+$  such that  $i \in [0, n]$  and S' is a subset of  $\{q, p_1, \ldots, p_n, p_0.@l_0, \ldots, p_n.@l_n\}$  such that |S'| < n and S' contains at most one element path.

PROPOSITION 6.2. Let D be a DTD,  $\Sigma$  a set of FDs over D and  $\{q, p_1.@l_1, \ldots, p_n.@l_n\} \rightarrow p.@l$  a  $(D, \Sigma)$ -minimal anomalous FD, where  $q \in EPaths(D)$  and  $n \geq 1$ . If  $D' = D[p.@l := q.\tau[\tau_1.@l_1, \ldots, \tau_n.@l_n, @l]]$ , where  $\tau$ ,  $\tau_1, \ldots, \tau_n$  are new element types, and  $\Sigma' = \Sigma[p.@l := q.\tau[\tau_1.@l_1, \ldots, \tau_n.@l_n, @l]]$ , then  $AP(D', \Sigma') \subsetneq AP(D, \Sigma)$ .

PROOF. First, we prove that  $q.\tau.\tau_i.@l_i \notin AP(D', \Sigma')$ , for each  $i \in [1, n]$ . Suppose that there is  $S' \subseteq paths(D)$  such that  $S' \to q.\tau.\tau_i.@l_i$  is a nontrivial functional dependency in  $(D', \Sigma')^+$  for some  $i \in [1, n]$ . Notice that  $q.\tau.\tau_i \notin S'$ , since  $q.\tau.\tau_i \to q.\tau.\tau_i.@l_i$  is a trivial functional dependency. Let  $S_1 \cup S_2 = S'$ , where (1)  $S_1 \cap (\{q, q.\tau.@l\} \cup \{q.\tau.\tau_j \mid j \in [1, n] \text{ and } j \neq i\} \cup \{q.\tau.\tau_j.@l_j \mid j \in [1, n]\}) = \emptyset$  and (2)  $S_2 \subseteq \{q, q.\tau.@l\} \cup \{q.\tau.\tau_j \mid j \in [1, n] \text{ and } j \neq i\} \cup \{q.\tau.\tau_j.@l_j \mid j \in [1, n]\}$ .

If there is no an XML tree T' conforming to D', satisfying  $\Sigma'$  and containing a tuple t such that  $t.S_1 \cup S_2 \neq \bot$ , then  $S_1 \cup S_2 \rightarrow q.\tau.\tau_i$  must be in  $(D', \Sigma')^+$ . In this case  $q.\tau.\tau_i.@l_i \notin AP(D', \Sigma')$ . Suppose that there is an XML tree T' conforming to D', satisfying  $\Sigma'$  and containing a tuple t such that  $t.S_1 \cup S_2 \neq \bot$ . In this case, by definition of  $\Sigma'$  it is straightforward to prove that  $S_2 \rightarrow q.\tau.\tau_i.@l_i$  is in  $(D', \Sigma')^+$ .

<sup>&</sup>lt;sup>1</sup>If  $\perp$  can be a value of p.@l in  $tuples_D(T)$ , the definition must be modified slightly, by letting  $P'(\tau)$  be  $\tau_1^*, \ldots, \tau_n^*, (\tau'|\epsilon)$ , where  $\tau'$  is fresh, making @l an attribute of  $\tau'$ , and modifying the definition of FDs accordingly.

By definition of  $\Sigma'$  and  $(D, \Sigma)$ -minimality of  $\{q, p_1.@l_1, \ldots, p_n.@l_n\} \rightarrow p.@l_n$ one of the following is true: (1)  $S_2 \rightarrow q.\tau.\tau_i.@l_i$  is not an anomalous FD, (2)  $\{q, q.\tau.\tau_1.@l_1, \ldots, q.\tau.\tau_n.@l_n, q.\tau.@l\} = S_2 \cup \{q.\tau.\tau_i.@l_i\}$  or (3)  $\{q.\tau.\tau_j, q.\tau.\tau_1.@l_1, \ldots, q.\tau.\tau_n.@l_n, q.\tau.@l_n, q.\tau.@l\} = S_2 \cup \{q.\tau.\tau_i.@l_i\}$  for some  $j \neq i$  ( $j \in [1, n]$ ). In the first case,  $q.\tau.\tau_i.@l_i \notin AP(D, \Sigma')$ , so we assume that either (2) or (3) holds. We prove that  $S_2 \rightarrow q.\tau.\tau_i$  must be in  $(D, \Sigma')^+$ . If either (2) or (3) holds, then  $S_2 \cup \{q.\tau.\tau_i.@l_i\} \rightarrow q.\tau$  is in  $(D', \Sigma')^+$  since  $\{q, q.\tau.\tau_1.@l_1, \ldots, q.\tau.\tau_n.@l_n\} \rightarrow q.\tau$  is in  $\Sigma'$  and  $q.\tau.\tau_k \rightarrow q$  is a trivial FD in D', for every  $k \in [1, n]$ . Let T'be an XML tree conforming to D' and satisfying  $\Sigma'$  and  $t_1, t_2 \in tuples_D(T')$ such that  $t_1.S_2 = t_2.S_2$  and  $t_1.S_2 \neq \bot$ . Given that  $S_2 \rightarrow q.\tau.\tau_i.@l_i \in (D', \Sigma')^+$ ,  $t_1.q.\tau.\tau_i.@l_i = t_2.q.\tau.\tau_i.@l_i$ . If  $t_1.q.\tau.\tau_i.@l_i = \bot$ , then  $t_1.q.\tau.\tau_i = t_2.q.\tau.\tau_i = \bot$ . If  $t_1.q.\tau.\tau_i.@l_i \neq \bot$ , then  $t_1.q.\tau = t_2.q.\tau$  and  $t_1.q.\tau \neq \bot$ , because  $S_2 \cup \{q.\tau.\tau_i.@l_i\} \rightarrow q.\tau \in (D', \Sigma')^+$ . But, by definition of  $\Sigma', \{q.\tau, q.\tau.\tau_i.@l_i\} \rightarrow q.\tau.\tau_i \in \Sigma'$ , and, therefore,  $t_1.q.\tau.\tau_i = t_2.q.\tau.\tau_i$ . In any case, we conclude that  $t_1.q.\tau.\tau_i = t_2.q.\tau.\tau_i$ and, therefore,  $S_2 \rightarrow q.\tau.\tau_i \in (D', \Sigma')^+$ . Thus,  $q.\tau.\tau_i.@l_i \notin AP(D', \Sigma')$ .

In a similar way, we conclude that  $q.\tau.@l \notin AP(D', \Sigma')$ .

Second, we prove that for every  $S_3 \cup S_4 \subseteq paths(D) - \{p.@l\}, (D, \Sigma) \vdash S_3 \rightarrow S_4$  if and only if  $(D', \Sigma') \vdash S_3 \rightarrow S_4$ , and, thus, by considering the previous paragraph we conclude that  $AP(D', \Sigma') \subseteq AP(D, \Sigma)$ . Let  $S_3 \cup S_4 \subseteq paths(D) - \{p.@l\}$ . By definition of  $\Sigma'$ , we know that if  $(D, \Sigma) \vdash S_3 \rightarrow S_4$ , then  $(D', \Sigma') \vdash S_3 \rightarrow S_4$  and, therefore, we only need to prove the other direction. Assume that  $(D, \Sigma) \nvDash S_3 \rightarrow S_4$ . Then there exists an XML tree *T* such that  $T \models (D, \Sigma)$  and  $T \nvDash S_3 \rightarrow S_4$ . Define an XML tree *T'* from *T* by assigning  $\perp$  to  $q.\tau$  and removing the attribute @l from *last*(*p*). Then  $T' \models (D', \Sigma')$  and  $T' \nvDash S_3 \rightarrow S_4$ , since all the paths mentioned in  $\Sigma' \cup \{S_3 \rightarrow S_4\}$  are included in  $paths(D) - \{p.@l\}$ . Thus,  $(D', \Sigma') \nvDash S_3 \rightarrow S_4$ .

To conclude the proof, we note that  $p.@l \in AP(D, \Sigma)$  and  $p.@l \notin AP(D', \Sigma')$ , since  $p.@l \notin paths(D')$ . Therefore,  $AP(D', \Sigma') \subsetneq AP(D, \Sigma)$ .  $\Box$ 

6.1.3 *The Algorithm.* The algorithm applies the two transformations presented in the previous sections until the schema is in XNF, as shown in Figure 5. Step (2) of the algorithm corresponds to the "moving attributes" rule applied to an anomalous FD  $q \rightarrow p.@l$  and step (3) corresponds to the "creating new element types" rule applied to an anomalous FD  $\{q, p_1.@l_1, \ldots, p_n.@l_n\} \rightarrow p.@l$ . We choose to apply first the "moving attributes" rule since the other one involves minimality testing .

The algorithm shows in Figure 5 involves FD implication, that is, testing membership in  $(D, \Sigma)^+$  (and consequently testing XNF and  $(D, \Sigma)$ -minimality), which will be described in Section 7. Since each step reduces the number of anomalous paths (Propositions 6.1 and 6.2), we obtain:

THEOREM 6.3. The XNF decomposition algorithm terminates, and outputs a specification  $(D, \Sigma)$  in XNF.

Even if testing FD implication is infeasible, one can still decompose into XNF, although the final result may not be as good as with using the implication. A slight modification of the proof of Propositions 6.1 and 6.2 yields:

```
(1) If (D, Σ) is in XNF then return (D, Σ), otherwise go to step (2).
(2) If there is an anomalous FD X → p.@l and q ∈ EPaths(D) such that q ∈ X and q → X ∈ (D, Σ)<sup>+</sup>, then:

(2.1) Choose a fresh attribute @m
(2.2) D := D[p.@l := q.@m]
(2.3) Σ := Σ[p.@l := q.@m]
(2.4) Go to step (1)

(3) Choose a (D, Σ)-minimal anomalous FD X → p.@l, where X = {q, p1.@l1, ..., pn.@ln}

(3.1) Create fresh element types τ, τ1, ..., τn
(3.2) D := D[p.@l := q.τ[τ1.@l1, ..., τn.@ln, @l]]
(3.3) Σ := Σ[p.@l := q.τ[τ1.@l1, ..., τn.@ln, @l]]
(3.4) Go to step (1)
```

Fig. 5. XNF decomposition algorithm.

PROPOSITION 6.4. Consider a simplification of the XNF decomposition algorithm which only consists of step (3) applied to FDs  $S \rightarrow p.@l \in \Sigma$ , and in which the definition of  $\Sigma[p.@l := q.\tau[\tau_1.@l_1, ..., \tau_n.@l_n, @l]]$  is modified by using  $\Sigma$  instead of  $(D, \Sigma)^+$ . Then such an algorithm always terminates and its result is in XNF.

## 6.2 Lossless Decomposition

To prove that our transformations do not lose any information from the documents, we define the concept of lossless decompositions similarly to the relational notion of "calculously dominance" from Hull [1986]. That notion requires the existence of two relational algebra queries that translate back and forth between two relational schemas. Adapting the definition of Hull [1986] is problematic in our setting, as no XML query language yet has the same "yardstick" status as relational algebra for relational databases.

Instead, we define  $(D', \Sigma')$  as a lossless decomposition of  $(D, \Sigma)$  if there is a mapping f from paths in the DTD D' to paths in the DTD D such that for every tree  $T \models (D, \Sigma)$ , there is a tree  $T' \models (D', \Sigma')$  such that T and T' agree on all the paths with respect to this mapping f.

This can be done formally using the relational representation of XML trees via the  $tuples_D(\cdot)$  operator. Given DTDs D and D', a function  $f : paths(D') \rightarrow paths(D)$  is a mapping from D' to D if f is onto and a path p is an element path in D' if and only if f(p) is an element path in D. Given tree tuples  $t \in \mathcal{T}(D)$  and  $t' \in \mathcal{T}(D')$ , we write  $t \equiv_f t'$  if for all  $p \in paths(D') - EPaths(D')$ ,  $t' \cdot p = t$ . f(p). Given nonempty sets of tree tuples  $X \subseteq \mathcal{T}(D)$  and  $X' \subseteq \mathcal{T}(D')$ , we let  $X \equiv_f X'$ if for every  $t \in X$ , there exists  $t' \in X'$  such that  $t \equiv_f t'$ , and for every  $t' \in X'$ , there exist  $t \in X$  such that  $t \equiv_f t'$ . Finally, if T and T' are XML trees such that  $T \triangleleft D$  and  $T' \triangleleft D'$ , we write  $T \equiv_f T'$  if  $tuples_D(T) \equiv_f tuples_D(T')$ .

*Definition* 6.5. Given XML specifications  $(D, \Sigma)$  and  $(D', \Sigma')$ ,  $(D', \Sigma')$  is a lossless decomposition of  $(D, \Sigma)$ , written  $(D, \Sigma) \leq_{\text{lossless}} (D', \Sigma')$ , if there exists a mapping f from D' to D such that for every  $T \models (D, \Sigma)$  there is  $T' \models (D', \Sigma')$  such that  $T \equiv_f T'$ .

In other words, all information about a document conforming to  $(D, \Sigma)$  can be recovered from some document that conforms to  $(D', \Sigma')$ .

It follows immediately from the definition that  $\leq_{\text{lossless}}$  is transitive. Furthermore, we show that every step of the normalization algorithm is lossless.

**PROPOSITION 6.6.** If  $(D', \Sigma')$  is obtained from  $(D, \Sigma)$  by using one of the transformations from the normalization algorithm, then  $(D, \Sigma) \leq_{\text{lossless}} (D', \Sigma')$ .

**PROOF.** We consider the two steps of the normalization algorithm, and for each step generate a mapping f. The proofs that those mappings satisfy the conditions of Definition 6.5 are straightforward.

- (1) Assume that the "moving attribute" transformation was used to generate  $(D', \Sigma')$ . Then  $D' = D[p.@l := q.@m], \Sigma' = \Sigma[p.@l := q.@m]$  and  $q \to p.@l$  is an anomalous FD in  $(D, \Sigma)^+$ . In this case, the mapping f from D' to D is defined as follows. For every  $p' \in paths(D') \{q.@m\}, f(p') = p'$ , and f(q.@m) = p.@l.
- (2) Assume that the "creating new element types" transformation was used to generate  $(D', \Sigma')$ . Then  $(D', \Sigma')$  was generated by considering a  $(D, \Sigma)$ minimal anomalous FD  $\{q, p_1.@l_1, \ldots, p_n.@l_n\} \rightarrow p.@l$ . Thus,  $D' = D[p.@l := q.\tau[\tau_1.@l_1, \ldots, \tau_n.@l_n, @l]]$  and  $\Sigma' = \Sigma[p.@l := q.\tau[\tau_1.@l_1, \ldots, \tau_n.@l_n, @l]]$ . In this case, the mapping f from D' to D is defined as follows:  $f(q.\tau) = p, f(q.\tau.@l) = p.@l, f(q.\tau.\tau_i) = p_i, f(q.\tau.\tau_i.@l_i) = p_i.@l_i$  and f(p') = p' for the remaining paths  $p' \in paths(D')$ .  $\Box$

Thus, if  $(D', \Sigma')$  is the output of the normalization algorithm on  $(D, \Sigma)$ , then  $(D, \Sigma) \leq_{\text{lossless}} (D', \Sigma')$ .

In relational databases, the definition of lossless decomposition indicates how to transform instances containing redundant information into databases without redundancy. This transformation uses the projection operator. Notice that Definition 6.5 also indicates a way of transforming XML documents to generate well-designed documents: If  $(D, \Sigma) \leq_{\text{lossless}} (D', \Sigma')$ , then for every  $T \models (D, \Sigma)$  there exists  $T' \models (D', \Sigma')$  such that T and T' contain the same data values. The mappings  $T \mapsto T'$  corresponding to the two transformations of the normalization algorithm can be implemented in an XML query language, more precisely, using XQuery FLWOR<sup>2</sup> expressions. We use transformations of documents shown in Section 1 for illustration; the reader will easily generalize them to produce the general queries corresponding to the transformations of the normalization algorithm.

*Example* 6.7. Assume that the DBLP database is stored in a file dblp.xml. As shown in Example 1.2, this document can contain redundant information since year is stored multiple times for a given conference. We can solve this problem by applying the "moving attribute" transformation and making year an attribute of issue. This transformation can be implementing by using the

<sup>&</sup>lt;sup>2</sup>FLWOR stands for *for*, *let*, *where*, *order by*, and *return*.

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## following FLWOR expression:

```
let $root := document("dblp.xml")/db
<db>
{ for $co in $root/conf
  <conf>
    <title> { $co/title/text() } </title>,
    { for $is in $co/issue
      let $value := $is/inproceedings[position() = 1]/@year
      <issue year="{ $value }">
      { for $in in $is/inproceedings
        <inproceedings key="{ $in/@key }" pages="{ $in/@pages }">
        { for $au in $in/author
          <author> { $au/text() } </author>,
          <title> { $in/title/text() } </title>
        7
        </inproceedings>
      }
      </issue>
   }
  </conf>
}
</db>
```

The XPath expression *\$is/inproceedings[position() = 1]/@year* is used to retrieve for every issue the value of the attribute year in the first article in that issue. For every issue this number is stored in a variable *\$value* and it becomes the value of its attribute year: <issue year="{*\$value*}">.

*Example* 6.8. Assume that the XML document shown in Figure 1 is stored in a file university.xml. This document stores information about courses in a university and it contains redundant information since for every student taking a course we store his/her name. To solve this problem, we split the information about names and grades by creating an extra element type, info, for student information. This transformation can be implemented as follows.



We omitted the query that removes name as a child of student since it can be done as in the previous example.

## 6.3 Eliminating Additional Assumptions

Finally, we have to show how to get rid of the additional assumption that for every anomalous FD  $X \to p.@l$ , every time that p.@l is not null, every path in *X* is not null. We illustrate this by a simple example.

Assume that *D* is the DTD shown in Figure 6(a). Every XML tree conforming to this DTD has as root an element of type *r* which has a child of type either *A* or *B* and an arbitrary number of elements of type *C*, each of them containing an attribute @1. Let  $\Sigma$  be the set of FDs  $\{r, A \to r, C, @1\}$ . Then,  $(D, \Sigma)$  is not in XNF since  $(D, \Sigma) \not\vdash r.A \rightarrow r.C.$ 

If we want to eliminate the anomalous FD  $r.A \rightarrow r.C.@l$ , we cannot directly apply the algorithm presented in Section 6.1, since this FD does not satisfy the basic assumption made in that section; it could be the case that r.C.@l is not null and *r*. *A* is null. To solve this problem we transform  $(D, \Sigma)$  into a new XML specification  $(D', \Sigma')$  that is essentially equivalent to  $(D, \Sigma)$  and satisfies the assumption made in Section 6.1. The new XML specification is constructed by splitting the disjunction. More precisely, DTD D' is defined as the DTD shown in Figure 6(b). This DTD contains two copies of the DTD D, one of then containing element type A, denoted by  $A_1$ , and the other one containing element type B, denoted by  $B_2$ . The set of functional dependencies  $\Sigma'$  is constructed by including the FD  $r.A \rightarrow r.C.@l$  in both DTDs, that is,  $\Sigma' = \{r.A_1 \rightarrow r.C_1.@l_1, r.A_2 \rightarrow r.C_1.@l_1\}$  $r.C_2.@l_2$ .

In the new specification  $(D', \Sigma')$ , the user chooses between having either A or *B* by choosing between either  $r_1$  or  $r_2$ . We note that the new FD  $r.A_2 \rightarrow r.C_2.@l_2$ is trivial and, therefore, to normalize the new specification we only have to take into account FD  $r.A_1 \rightarrow r.C_1.@l_1$ . This functional dependency satisfies the assumption made in Section 6.1, so we can use the decomposition algorithm presented in that section.

It is straightforward to generalize the methodology presented in the previous example for any DTD. In particular, if we have an arbitrary regular expression s in a DTD D = (E, A, P, R, r) and we have to split it into one regular expression containing an element type  $\tau \in E$  and another one not containing this symbol, we consider regular expressions  $s \cap (E^* \tau E^*)$  and  $s - (E^* \tau E^*)$ .

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- <!ELEMENT ProcessSpecification (Documentation\*, SubstitutionSet\*, (Include | BusinessDocument | ProcessSpecification | Package | BinaryCollaboration | BusinessTransaction | MultiPartyCollaboration)\*)> <!ELEMENT Include (Documentation\*)> <!ELEMENT BusinessDocument (ConditionExpression?, Documentation\*)>
- <!ELEMENT SubstitutionSet (DocumentSubstitution | AttributeSubstitution | Documentation)\*>
- <!ELEMENT BinaryCollaboration (Documentation\*, InitiatingRole, RespondingRole, (Documentation | Start | Transition | Success | Failure | BusinessTransactionActivity | CollaborationActivity | Fork | Join)\*)> <!ELEMENT Transition (ConditionExpression?, Documentation\*)>

```
_____; ____; _____; ____; , ____;
```

Fig. 7. Part of the Business Process Specification Schema of ebXML.

# 7. REASONING ABOUT FUNCTIONAL DEPENDENCIES

In the previous section, we saw that it is possible to losslessly convert a DTD into one in XNF. The algorithm used XML functional dependency implication. Although XML FDs and relational FDs are defined similarly, the implication problem for the former class is far more intricate. In this section, we study the implication problem for XML functional dependencies. In Sections 7.1 and 7.2, we introduce two classes of DTDs for which the implication problem can be solved efficiently. These classes include most of real-world DTDs. In Section 7.3, we introduce two classes of DTDs for which the implication problem is coNP-complete. In Section 7.4, we show that, unlike relational FDs, XML FDs are not finitely axiomatizable. Finally, in Section 7.5, we study the complexity of the XNF satisfaction problem. In all these sections, we assume, without loss of generality, that all FDs have a single path on the right-hand side.

## 7.1 Simple Regular Expressions

Typically, regular expressions used in DTDs are rather simple. We now formulate a criterion for simplicity that corresponds to a common practice of writing regular expressions in DTDs. Given an alphabet A, a regular expression over A is called *trivial* if it of the form  $s_1, \ldots, s_n$ , where for each  $s_i$  there is a letter  $a_i \in A$  such that  $s_i$  is either  $a_i$  or  $a_i$ ? (which abbreviates  $a_i|\epsilon$ ), or  $a_i^+$  or  $a_i^*$ , and for  $i \neq j$ ,  $a_i \neq a_j$ . We call a regular expression s simple if there is a trivial regular expression s' such that any word w in the language denoted by s is a permutation of a word in the language denoted by s', and vice versa. Simple regular expressions were also considered in Abiteboul et al. [2001] under the name of *multiplicity atoms*.

For example,  $(a|b|c)^*$  is simple:  $a^*$ ,  $b^*$ ,  $c^*$  is trivial, and every word in  $(a|b|c)^*$  is a permutation of a word in  $a^*$ ,  $b^*$ ,  $c^*$  and vice versa. A DTD is called *simple* if all productions in it use simple regular expressions over  $E \cup \{S\}$ . Simple regular expressions are prevalent in DTDs. For instance, the Business Process Specification Schema of ebXML [ebXML 2001], a set of specifications to conduct business over the Internet, is a simple DTD. Part of this schema is showed in Figure 7.

THEOREM 7.1. The implication problem for FDs over simple DTDs is solvable in quadratic time.

**PROOF SKETCH.** Here we present the sketch of the proof. The complete proof can be found in electronic Appendix A.1.

In the first part of the proof, we show that given a simple DTD D and a set of FDs  $\Sigma \cup \{S \to p\}$  over D, the problem of verifying whether  $\Sigma \not\vdash S \to p$  can be reduced to the problem of finding a counterexample to a certain implication problem. That is, we need to find an XML tree T such that  $T \models (D, \Sigma), T \not\models S \to$ p, T contains two tree tuples and T satisfies some additional conditions that depend on the simplicity of D. Essentially, if an element type is allowed to occur zero times (a? or  $a^*$ ), then in constructing the counterexample such elements not need to be considered if they are irrelevant to the functional dependencies under consideration. Furthermore, all the element types in a regular expression in D can be considered independently. Observe that this condition is not longer valid if a regular expression in D contains a disjunction (D is not simple). For instance, if (a|b) is a regular expression in D, then a and b are not independent; if a does not appear in an XML tree conforming to D, then b appears in this tree.

In the second part of the proof, we show that the problem of finding this counterexample can be reduced to the problem of verifying if a certain propositional formula  $\varphi$ , constructed from D and  $\Sigma \cup \{S \rightarrow p\}$ , is satisfiable. This formula is of the form  $\varphi_1 \vee \cdots \vee \varphi_n$ , where n is at most the length of the path p and each  $\varphi_i$  ( $i \in [1, n]$ ) is a conjunction of Horn clauses and is of linear size in the size of D and  $\Sigma \cup \{S \rightarrow p\}$ . Given that the consistency problem for Horn clauses is solvable in linear time [Dowling and Gallier 1984], we conclude that the counterexample can be found in quadratic time and, therefore, our original problem can be solved in quadratic time.  $\Box$ 

## 7.2 Small Number of Disjunctions

In a simple DTD, disjunction can appear in expressions of the form  $(a|\epsilon)$  or  $(a|b)^*$ , but a general disjunction (a|b) is not allowed. For example, the following DTD cannot be represented as a simple DTD:

```
<!DOCTYPE university [
  <!ELEMENT university (course*)>
  <!ELEMENT course (number, student*)>
  <!ELEMENT number (#PCDATA)>
  <!ELEMENT student ((name | FLname), grade)>
  <!ELEMENT name (#PCDATA)>
  <!ELEMENT FLname (first_name, last_name)>
  <!ELEMENT first_name (#PCDATA)>
  <!ELEMENT last_name (#PCDATA)>
  <!ELEMENT grade (#PCDATA)>
]>
```

In this example, every student must have a name. This name can be an string or it can be a composition of a first and a last name. It is desirable to express

constraints on this kind of DTDs. For instance,

*student.name*. $S \rightarrow student$ ,

{*student*.*FLname*.first\_name.S, *student*.*FLname*.last\_name.S}  $\rightarrow$  *student*,

are functional dependencies in this domain. It is also desirable to reason about these constraints efficiently. Often, a DTD is not simple because a small number of regular expressions in it are not simple. In this section, we will show that there is a polynomial-time algorithm for reasoning about constraints over DTDs containing a small number of disjunctions.

A regular expression *s* over an alphabet *A* is a *simple disjunction* if  $s = \epsilon$ , s = a, where  $a \in A$ , or  $s = s_1 | s_2$ , where  $s_1$ ,  $s_2$  are simple disjunctions over alphabets  $A_1$ ,  $A_2$  and  $A_1 \cap A_2 = \emptyset$ . A DTD D = (E, A, P, R, r) is called *disjunctive* if for every  $\tau \in E$ ,  $P(\tau) = s_1, \ldots, s_m$ , where each  $s_i$  is either a simple regular expression or a simple disjunction over an alphabet  $A_i$  ( $i \in [1, m]$ ), and  $A_i \cap A_j = \emptyset$  ( $i, j \in [1, m]$  and  $i \neq j$ ). This generalizes the concept of a simple DTD.

With each disjunctive DTD *D*, we associate a number  $N_D$  that measures the complexity of unrestricted disjunctions in *D*. Formally, for a simple regular expression *s*,  $N_s = 1$ . If *s* is a simple disjunction, then  $N_s$  is the number of symbols | in *s* plus 1. If  $P(\tau) = s_1, \ldots, s_n$ , then  $N_{\tau}$  is 1, if  $s_1, \ldots, s_n$  is a simple regular expression,  $N_{\tau} = |\{p \in paths(D) \mid last(p) = \tau\}| \times N_{s_1} \times \cdots \times N_{s_n}$ otherwise. Finally,  $N_D = \prod_{\tau \in E} N_{\tau}$ .

THEOREM 7.2. For any fixed c > 0, the FD implication problem for disjunctive DTDs D with  $N_D \le ||D||^c$  is solvable in polynomial time.<sup>3</sup>

**PROOF SKETCH.** Here we present the sketch of the proof. The complete proof can be found in electronic Appendix A.2.

The main idea of this proof is that the implication problem for disjunctive DTDs can be reduced to a number of implication problems for simple DTDs by splitting the disjunctions. More precisely, given a disjunctive DTD D and a set of functional dependencies  $\Sigma \cup \{S \rightarrow p\}$  over D, there exist  $(D_1, \Sigma_1), \ldots, (D_n, \Sigma_n)$  such that each  $D_i$   $(i \in [1, n])$  is a simple DTD,  $\Sigma_i$  is a set of functional dependencies over  $D_i$   $(i \in [1, n])$  and  $(D, \Sigma) \vdash S \rightarrow p$  if and only if  $(D_i, \Sigma_i) \vdash S \rightarrow p$  for every  $i \in [1, n]$ . The number n of implication problems for simple DTDs is at most  $N_D$ . Thus, since the implication problem for simple DTDs can be solved in quadratic time (see Theorem 7.1), the implication problem for disjunctive DTDs D with  $N_D \leq ||D||^c$ , for some constant c, can be solved in polynomial time.  $\Box$ 

## 7.3 Relational DTDs

There are some classes of DTDs for which the implication problem is not tractable. One such class consists of arbitrary disjunctive DTDs. Another class is that of *relational DTDs*. We say that *D* is a relational DTD if for each XML tree  $T \models D$ , if *X* is a nonempty subset of *tuples*<sub>D</sub>(*T*), then *trees*<sub>D</sub>(*X*)  $\models$  *D*. This

 $<sup>||\</sup>cdot||$  is the size of the description of an object. For instance, ||p|| is the length of the path p and ||S|| is the sum of the lengths of the paths in S.

class contains regular expressions like the one below, from a DTD for Frequently Asked Questions [Higgins and Jelliffe 1999]:

<!ELEMENT section (logo\*, title,

(qna+ | q+ | ( p | div | section)+))>

There exist nonrelational DTDs (for example, <!ELEMENT a (b,b)>). However:

**PROPOSITION 7.3.** Every disjunctive DTD is relational.

**PROOF.** Let D = (E, A, P, R, r) be a disjunctive DTD, T an XML tree conforming to D and X a non-empty subset of  $tuples_D(T)$ . Assume that  $trees_D(X) \not\models D$ , that is, there is an XML tree T' = (V, lab, ele, att, root) in  $trees_D(X)$  such that  $T' \not\models D$ . Then, there is a vertex  $v \in V$  reachable from the root by following a path p such that  $lab(v) = \tau$  and ele(v) does not conform to the regular expression  $P(\tau)$ .

If  $P(\tau) = s$ , where *s* is a simple disjunction over an alphabet *A*, then there is  $t' \in X$  such that t'.p = v and  $t'.p.a = \bot$ , for each  $a \in A$ . Thus, given that  $T \models D$ , we conclude that there is a tuple  $t \in tuples_D(T)$  such that  $t.p.b \neq \bot$ , for some  $b \in A$ , and t'.w = t.w for each  $w \in paths(D)$  such that p.b is not a prefix of *w*. Hence,  $t' \sqsubset t$ . But, this contradicts the definition of  $tuples_D(\cdot)$ , since  $t', t \in tuples_D(T)$ . The proof for  $P(\tau) = s_1, \ldots, s_n$ , where each  $s_i$   $(i \in [1, n])$  is either a simple regular expression or a simple disjunction, is similar.  $\Box$ 

THEOREM 7.4. The FD implication problem over relational DTDs and over disjunctive DTDs is coNP-complete.

**PROOF.** Here we prove the intractability of the implication problem for disjunctive DTDs. The coNP membership proof can be found in electronic Appendix A.3.

In order to prove the coNP-hardness, we will reduce SAT-CNF to the complement of the implication problem for disjunctive DTDs. Let  $\theta$  be a propositional formula of the form  $C_1 \wedge \cdots \wedge C_n$ , where each  $C_i$  ( $i \in [1, n]$ ) is a clause. Assume that  $\theta$  uses propositional variables  $x_1, \ldots, x_m$ .

We need to construct a disjunctive DTD *D* and a set of functional dependencies  $\Sigma \cup \{\varphi\}$  such that  $(D, \Sigma) \not\vdash \varphi$  if and only if  $\theta$  is satisfiable. We define the DTD D = (E, A, P, R, r) as follows.

 $E = \{r, B, C\} \cup \{C_{i,j} \mid C_i \text{ mentions literal } x_j\} \cup \{\overline{C}_{i,j} \mid C_i \text{ mentions literal } \neg x_j\},\$  $A = \{@l\}.$ 

In order to define *P*, first we define a function for translating clauses into regular expressions. If the set of literal mentioned in the clause  $C_i$  ( $i \in [1, n]$ ) is  $\{x_{j_1}, \ldots, x_{j_p}, \bar{x}_{k_1}, \ldots, \bar{x}_{k_q}\}$ , then

$$tr(C_i) = C_{i,j_1} | \cdots | C_{i,j_p} | \bar{C}_{i,k_1} | \cdots | \bar{C}_{i,k_q}.$$

We define the function *P* on the root as  $P(r) = tr(C_1), \ldots, tr(C_n)$ , *B*, *C*<sup>\*</sup>. For the remaining elements of *E*, we define *P* as  $\epsilon$ . Finally,  $R(r) = \emptyset$  and  $R(\tau) = \{@l\}$  for every  $\tau \in E - \{r\}$ . For example, Figure 8 shows the DTD generated from a propositional formula  $(x_1 \vee x_2) \land (x_1 \vee \neg x_3)$ .



Fig. 8. DTD generated from a formula  $(x_1 \lor x_2) \land (x_1 \lor \neg x_3)$ .

For each pair of elements  $C_{i,j}$ ,  $\tilde{C}_{k,j} \in E$ , the set of functional dependencies  $\Sigma$  includes the constraint { $r.C_{i,j}.@l$ ,  $r.\tilde{C}_{k,j}.@l$ }  $\rightarrow r.C.@l$ . Functional dependency  $\varphi$  is defined as  $r.B.@l \rightarrow r.C.@l$ .

We now prove that  $(D, \Sigma) \not\vdash \varphi$  if and only if  $\theta$  is satisfiable.

( $\Rightarrow$ ) Suppose that  $(D, \Sigma) \not\vdash \varphi$ . Then, there is an XML tree *T* such that  $T \models (D, \Sigma)$  and  $T \not\models \varphi$ . We define a truth assignment  $\sigma$  from *T* as follows. For each  $j \in [1, m]$ , if there is  $i \in [1, n]$  such that *r* has a child of type  $C_{i,j}$  in *T*, then  $\sigma(x_j) = 1$ ; otherwise,  $\sigma(x_j) = 0$ . We now prove that  $\sigma \models C_i$ , for each  $i \in [1, n]$ . By definition of *D*, there is  $j \in [1, m]$  such that *r* has a child in *T* of type either  $C_{i,j}$  or  $\tilde{C}_{i,j}$ . In the first case,  $C_i$  contains the literal  $x_j$  and  $\sigma(x_j) = 1$ , by definition of  $\sigma$ . Therefore,  $\sigma \models C_i$ . In the second case,  $C_i$  contains a literal  $\neg x_j$ . If  $\sigma(x_j) = 1$ , then there is  $k \in [1, n]$  such that *r* has a child of type  $C_{k,j}$  in *T*, by definition of  $\sigma$ . Since  $\{r.C_{k,j}.@l, r.\tilde{C}_{i,j}.@l\} \rightarrow r.C.@l$  is a constraint in  $\Sigma$ , all the nodes in *T* of type *C* have the same value in the attribute @l. Thus,  $T \models r.B.@l \rightarrow r.C.@l$ , a contradiction. Hence,  $\sigma(x_j) = 0$  and  $\sigma \models C_i$ .

( $\Leftarrow$ ) Suppose that  $\theta$  is satisfiable. Then, there exists a truth assignment  $\sigma$  such that  $\sigma \models \theta$ . We define an XML tree *T* conforming to *D* as follows. For each  $i \in [1, n]$ , choose a literal  $I_j$  in  $C_i$  such that  $\sigma \models I_j$ . If  $I_j = x_j$ , then *r* has a child of type  $C_{i,j}$  in *T*; otherwise, *r* has a child of type  $\tilde{C}_{i,j}$  in *T*. Moreover, *r* has one child of type *B* and two children of type *C*. We assign two distinct values to the attribute @*I* of the nodes of type *C*, and the same value to the rest of the attributes in *T*. Thus,  $T \not\models \varphi$ , and it is easy to verify that  $T \models \Sigma$ . This completes the proof.  $\Box$ 

#### 7.4 Nonaxiomatizability of XML Functional Dependencies

In this section, we present a simple proof that XML FDs cannot be finitely axiomatized. This proof shows that, unlike relational databases, there is a nontrivial interaction between DTDs and functional dependencies. To present this proof, we need to introduce some terminology.

Given a DTD *D* and a set of functional dependencies  $\Sigma$  over *D*, we say that  $(D, \Sigma)$  is *closed under implication* if for every FD  $\varphi$  over *D* such that  $(D, \Sigma) \vdash \varphi$ , it is the case that  $\varphi \in \Sigma$ . Furthermore, we say that  $(D, \Sigma)$  is *closed under k-ary implication*,  $k \ge 0$ , if for every FD  $\varphi$  over *D*, if there exists  $\Sigma' \subseteq \Sigma$  such that  $|\Sigma'| \le k$  and  $(D, \Sigma') \vdash \varphi$ , then  $\varphi \in \Sigma$ . For example, if  $(D, \Sigma)$  is closed under 0-ary implication, then  $\Sigma$  contains all the trivial FDs.

Since the implication problem for relational FDs is finitely axiomatizable, there exists  $k \ge 0$  such that each relation schema  $R(A_1, ..., A_n)$  admits a *k*-ary

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ground axiomatization for the implication problem, that is, an axiomatization containing rules of the form *if*  $\Gamma$  *then*  $\gamma$ , where  $\Gamma \cup \{\gamma\}$  is a set of FDs over  $R(A_1, \ldots, A_n)$  and  $|\Gamma| \leq k$ . For instance, R(A, B, C) admits a 2-ary ground axiomatization including, among others, the following rules: *if*  $\emptyset$  *then*  $AB \rightarrow A$ , *if*  $A \rightarrow B$  *then*  $AC \rightarrow BC$  and *if*  $\{A \rightarrow B, B \rightarrow C\}$  *then*  $A \rightarrow C$ . Similarly, if there exists a finite axiomatization for the implication problem of XML FDs, then there exists  $k \geq 0$  such that each DTD D admits a (possible infinite) k-ary ground axiomatization for the implication problem. The contrapositive of the following proposition gives us a sufficient condition for showing that the XML FD implication problem does not admit a k-ary ground axiomatization for every  $k \geq 0$  and, therefore, it does not admit a finite axiomatization.

PROPOSITION 7.5. For every  $k \ge 0$ , if there is a k-ary ground axiomatization for the implication problem of XML FDs, then for every DTD D and set of FDs  $\Sigma$  over D, if  $(D, \Sigma)$  is closed under k-ary implication then  $(D, \Sigma)$  is closed under implication.

**PROOF.** This proposition was proved in Abiteboul et al. [1995] for the case of relational databases. The proof for XML FDs is similar.  $\Box$ 

THEOREM 7.6. The implication problem for XML functional dependencies is not finitely axiomatizable.

**PROOF.** By Proposition 7.5, for every  $k \ge 0$ , we need to exhibit a DTD  $D_k$  and a set of functional dependencies  $\Sigma_k$  such that  $(D_k, \Sigma_k)$  is closed under *k*-ary implication and  $(D_k, \Sigma_k)$  is not closed under implication.

The DTD  $D_k = (E, A, P, R, r)$  is defined as follows:  $E = \{A_1, \ldots, A_k, A_{k+1}, B\}, A = \emptyset, P(r) = (A_1 | \cdots | A_k | A_{k+1}), B^* \text{ and } P(\tau) = \epsilon \text{ for every } \tau \in E - \{r\}.$ The set of FDs  $\Sigma_k$  is defined as the union of the following sets:

$$-\{r.A_i \to r.B \mid i \in [1, k+1]\} \cup \{\{r, r.A_i\} \to r.B \mid i \in [1, k+1]\}, -\{S \to p \mid S \to p \text{ is a trivial FD in } D_k\}.$$

It is easy to see that if  $\varphi$  is not a trivial functional dependency in  $D_k$  and  $\varphi \notin \Sigma_k$ , then  $\varphi = r \rightarrow r.B$ . Thus, in order to prove that  $(D_k, \Sigma_k)$  is closed under *k*-ary implication and is not closed under implication, we have to show that:

(1) For every  $\Sigma' \subseteq \Sigma_k$  such that  $|\Sigma'| \leq k$ ,  $(D_k, \Sigma') \not\vdash r \rightarrow r.B$ . Since  $|\Sigma'| \leq k$ , there exists  $i \in [1, k+1]$  such that  $r.A_i \rightarrow r.B \notin \Sigma'$  and  $\{r, r.A_i\} \rightarrow r.B \notin \Sigma'$ . Thus, an XML tree *T* defined as



conforms to  $D_k$ , satisfies  $\Sigma'$  and does not satisfy  $r \to r.B$ . We conclude that  $(D_k, \Sigma') \not\vdash r \to r.B$ .

(2)  $(D_k, \Sigma_k) \vdash r \rightarrow r.B$ . This proof is straightforward.

This completes the proof of the theorem.  $\Box$ 

7.5 The Complexity of Testing XNF

Relational DTDs have the following useful property that lets us establish the complexity of testing XNF.

PROPOSITION 7.7. *Given a relational DTD D and a set*  $\Sigma$  *of FDs over D,*  $(D, \Sigma)$  *is in XNF iff for each nontrivial FD of the form*  $S \to p.@l \text{ or } S \to p.S$  *in*  $\Sigma, S \to p \in (D, \Sigma)^+$ .

**PROOF.** The proof is given in electronic Appendix A.4.

From this, we immediately derive:

COROLLARY 7.8. Testing if  $(D, \Sigma)$  is in XNF can be done in cubic time for simple DTDs, and is coNP-complete for relational DTDs.

# 8. RELATED WORK AND FUTURE RESEARCH

It was introduced in Embley and Mok [2001] an XML normal form defined in terms of functional dependencies, multivalued dependencies and inclusion constraints. Although that normal form was also called XNF the approach of Embley and Mok [2001] was very different from ours. The normal form of Embley and Mok [2001] was defined in terms of two conditions: XML specifications must not contain redundant information with respect to a set of constraints, and the number of schema trees (see Section 5.2) must be minimal. The normalization process is similar to the ER approach in relational databases. A conceptual-model hypergraph is constructed to model the real world and an algorithm produces an XML specification in XNF. It was proved in Arenas and Libkin [2003] that an XML specification given by a DTD D and a set  $\Sigma$  of XML functional dependencies is in XNF if and only if no XML tree conforming to D and satisfying  $\Sigma$  contains redundant information. Thus, for the class of functional dependencies defined in this article, the XML normal form introduced in Embley and Mok [2001] is more restrictive than our XML normal form.

Normal forms for extended context-free grammars, similar to the Greibach normal form for CFGs, were considered in Albert et al. [2001]. These, however, do not necessarily guarantee good XML design.

The functional dependency language used in Embley and Mok [2001] is based on a language for nested relations and it does not consider relative constraints. In a recent article [Lee et al. 2002], a language for expressing functional dependencies for XML was introduced. In that language, a functional dependency is an expression of the form  $(p, [q_1, \ldots, q_n \rightarrow q_{n+1}])$ , where p is a path and every  $q_i$   $(i \in [1, n+1])$  is of the form  $\tau .@I$ , where  $\tau$  is an element type. An XML tree T satisfies this constraint if for any two subtrees  $T_1$ ,  $T_2$  of T whose roots are nodes reachable from the root of T by following path p, if  $T_1$  and  $T_2$  agree on the value of  $q_i$ , for every  $i \in [1, n]$ , then they agree on the value of  $q_{n+1}$ . This language does not consider relative constraints and its semantics only works properly if some syntactic restrictions are imposed on the functional dependencies [Lee et al. 2002]. The normalization problem is not considered in Lee et al. [2002].

Other proposals for XML constraints (mostly keys) have been studied in Buneman et al. [2001a, 2001b] and Fan and Siméon [2000]; these constraints do not use DTDs. XML constraints that takes DTDs into account are studied in Fan and Libkin [2001].

Numerous surveys of relational normalization can be found in the literature [Beeri et al. 1978; Kanellakis 1990; Abiteboul et al. 1995]. Normalization for nested relations and object-oriented databases is studied in Özsoyoglu and Yuan [1987], Mok et al. [1996], and Tari et al. [1997]. Coding nested relations into flat ones, similar to our tree tuples, is done in Suciu [1997] and Van den Bussche [2001]. We use functional dependencies over incomplete relations using the techniques from Atzeni and Morfuni [1984], Buneman et al. [1991], Grahne [1991], Imielinski and Lipski [1984], and Levene and Loizou [1998].

## 8.1 Future Research

The decomposition algorithm can be improved in various ways, and we plan to work on making it more efficient. We also would like to find a complete classification of the complexity of the FD implication problem for various classes of DTDs.

As prevalent as BCNF is, it does not solve *all* the problems of relational schema design, and one cannot expect XNF to address all shortcomings of DTD design. We plan to work on extending XNF to more powerful normal forms, in particular by taking into account multivalued dependencies which are naturally induced by the tree structure.

## ELECTRONIC APPENDIX

The electronic appendix for this article can be accessed in the ACM Digital Library.

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