Optimization of Nested XQuery Expressions with Orderby Clauses

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Abstract-XQuery, the defacto XML query language, is a functional language with operational semantics, which precludes the direct application of classical query optimization techniques. The features of XQuery, such as nested expressions and ordered semantics, further aggravate this situation. The appropriate extension of existing optimization techniques to XQuery processing hence represents an important and non-trivial task. We propose an algebraic rewriting technique of nested XQuery expressions containing explicit orderby clauses. Unlike prior work, this technique enables the optimization of nested XQuery expressions not only with set but also with ordered sequence semantics. Our technique is based on two steps. First, we perform algebraic query unnesting. Second, we apply query minimization techniques that exploit pairwise XPath set containment after pulling up ordersensitive operations. We illustrate how our proposed technique is able to not only successfully tackle the XQuery logical optimization problem solved in the NEXT framework, but in addition to also to correctly support ordered semantics.

We have implemented the proposed optimization techniques on top of the XAT algebraic framework in our RainbowCore project. We show the performance gain achievable by our approach using an experimental study with the RainbowCore engine.

I. INTRODUCTION

The XQuery language [23] and the XML path language [22] have both been widely accepted for querying XML data. Several optimization techniques have been proposed for XPath expressions, such as XPath containment [9], answering XPath queries using views [2] and XPath satisfiability [13]. The direct applicability of these techniques to the XQuery ¹ language is precluded by the features of XQuery, such as *nested* XQuery expressions and the *orderby* clause. How to extend existing optimization techniques to complex XQuery processing becomes an important and non-trivial task.

XQuery expressions are typically composed of highly nested FLWOR (short for the *for*, *let*, *where*, *orderby* and *return*) blocks to retrieve and reconstruct hierarchical XML data. An XQuery expression is said to be *correlated* if an inner FLWOR block refers to a bound variable defined outside this block.

¹In this paper, we use the term XQuery to refer to complex XQuery expressions that cannot be rewritten as XPath expressions.

Unlike in relational databases, order is an important issue for XML queries. By default, both the XPath and XQuery languages are order sensitive. The XPath language has order sensitive functions such as *position()*, *first()* and *last()*. All the functions used in the XPath language work on the document order. Informally, document order is the order defined by a pre-order, depth-first traversal of the nodes in an XML document. In addition XQuery expressions may contain the *orderby* clause as part of a FLWOR expression that overwrites the document order for XML fragments generated by that XQuery expression based on explicit sorting.

In this paper, we discuss how to optimize query expressions that contain orderby clauses in the nested XQuery context. We propose an algebraic rewriting technique of nested XQuery expressions containing explicit orderby clauses. Our technique is based on two steps. First, we perform algebraic query unnesting based on the principles of magic decorrelation [25]. Second, we apply query minimization techniques that exploit pairwise XPath set containment after pulling up order-sensitive operations. In the NEXT framework [5], the authors propose a new nested Xtableaux approach for logical XQuery optimization. We now go beyond this work, while using a more traditional algebraic rewriting and unnesting approach that follows well established principle and practice in industrial query engines. Using our approach, we are able to not only achieve the optimization specified in the NEXT framework but also to correctly support ordered semantics.

Example: The following XQuery expression sorts part of the authors by their last name and groups books together with their first author, then sorts each author's book by publishing year. This query is adapted from W3C XQuery Use Cases XMP Q4 [21] by adding the position function and orderby clauses.

In this example XQuery expression, the outer for clause

binds \$a to a sequence of authors appearing in the XML document. The outer *orderby* clause sorts this sequence by the authors' last name. For each instance of \$a, the inner query block can be evaluated. Such an intuitive iterative execution tends to be less efficient than an equivalent collection-oriented execution strategy, since for every binding of \$a, many operation steps are repeated in the inner subquery. For efficient execution of such XQuery expressions, decorrelation is necessary. After decorrelation, a join will be generated to connect the outer and inner query blocks, and a one time navigation of the XML document for the inner subquery is sufficient. While we briefly sketch the decorrelation process in Section IV, details of this process can be found in [24].

Our decorrelation technique is inspired by the magic decorrelation proposed by Seshadri et al. [20]. The authors proposed a decorrelation method for complex correlated SQL queries. Our approach, called the *Magic Branch*, is a natural extension and adaption of this technique towards more efficient XQuery decorrelation.

After decorrelation, a closer inspection of the example XQuery reveals that we can even do better: the navigations in the "outer" and "inner" query blocks are similar. The author nodes in b/author[1] is contained in the author nodes in aunder set semantics. These navigations however differ in that the author nodes in a are sorted by their last names, whereas the ones in b/author[1] are sorted by the books' year. Even though these two navigations are not identical, they are similar enough so that one of the two navigations could be saved. We thus suggest that a more "optimal" query plan for this example query will be: 1) get all the books; 2) get the first author associated with each book; 3) sort by the author's last name (major order) and the book publication year (minor order); and 4) group all the book title by authors. In this paper, we will show a systematic approach for achieving such optimized query plan.

Such XQuery expressions are not rare; rather such cases will always occur when a nested XQuery expression is used for reconstructing the original XML corresponding to different schema. If we do not discover that the two navigations are similar, the query plan would have included a join between these two navigations. Instead our approach enables the elimination of the redundant navigations whenever possible. In this paper, we will describe how to adapt known XPath containment algorithms to reduce redundant XPath navigations in XQuery expressions containing *orderby* clauses.

We have implemented the proposed optimization techniques on top of the XAT algebraic framework in our RainbowCore [26] project. The XAT algebra extends the relational algebra by allowing collection-valued columns and being orderpreserving. It also introduces new operators to express the necessary XQuery semantics. However, the main idea of our approach is generic and can be applied to other similar algebras like NAL [16] and SAL [3].

Our work brings forth the following novel contributions to XQuery optimization.

- To the best of our knowledge, we are the first to provide a practical approach handling XQuery logical minimization with sequence semantics.
- Our magic branch approach inherits the advantages of magic decorrelation and opens the opportunities for further optimizations using existing techniques.
- We implement the magic branch decorrelation and the algebraic tree minimization in our XQuery engine.
- We conduct a preliminary experimental study, that shows the performance improvements achievable by our proposed approaches.

This paper is organized as follows. We first give a description of the related work in Section II and briefly describe the algebraic framework used in this paper in Section III. The magic branch decorrelation approach and the minimization techniques are discussed in Sections IV and V respectively. We present our experimental results in Section VI, while Section VII concludes this paper.

II. RELATED WORK

Modern database systems [12], [7], [20] attempt to merge subquery blocks into the outer query block, thereby eliminating correlations and avoiding nested iterative evaluation. Such "decorrelation" is typically done by introducing outer join and grouping operations.

More recently, methods that focus on the efficiency of decorrelated subqueries have been proposed. In [20], the authors proposed a technique called magic decorrelation for nested SQL queries. By materializing results from subqueries and postponing the Outer Join, this approach produces a typically more efficient query plan. Our proposal is conceptually inspired by this technique.

Decorrelation of XQuery expressions has also been studied in relationship to native XML query engines. One effort is by Paparizos et al. [17] in the TIMBER system. There the authors pointed out the implicit use of grouping constructs in the XQuery's result construction. Recognizing and explicitly adding the grouping operation can lead to unnesting of XQuery expressions. Their work is based on the tree algebra in TIMBER. Their grouping operator is defined on sets of trees. One drawback of this approach is that their transformation from the XQuery language to the TAX tree is complex and not complete, as pointed out in [16]. Also they do not consider ordering.

Fegaras [8] and May et al. [16] have studied XQuery unnesting based on the unnesting techniques from objectoriented query languages [4], [7]. However, these works do not discuss decorrelation of XQuery expressions containing *orderby* clauses, which is the main focus of our work. The work that is most closely related to ours is the NEXT [5] framework, where the authors study minimization of nested XQuery expressions under "mixed set and bag semantics". Here the authors introduce new syntactic constructs to the XQuery language. Compared to this, we use a more traditional algebraic approach for decorrelation. In fact, we demonstrate that our classical algebraic rewriting achieves the same XQuery minimization as in the NEXT framework. Further our approach extends this problem and solves it under sequence semantics, that is, by considering nested XQuery expressions with explicit orderby clauses. In addition we show how to reuse existing XPath containment and matching approaches to achieve query minimization in the ordered context.

Query containment has been studied in depth for the relational model [14]. Query containment for XPath expressions has been discussed for various axes and quantifiers [9], tag variables and equality testing [1], etc. In [6] the authors study the containment problem for nested XQuery expressions with different fanouts. However none of these works consider the order semantics in XQuery; they do not even consider document order in XPath expressions. Our work thus provides a practical approach to fill the gap between the existing works of query containment and XQuery minimization with order semantics.

III. PRELIMINARIES

XQuery: In this paper, we consider a subset of the XQuery language [23] defined by the grammar in Fig. 1. This subset, plus some extensions of user-defined functions, suffices to express the XMark benchmark query set [19]. Besides the basic *FLWOR* clauses, the XQuery fragment we consider also includes order-related functions (e.g., the position function), and quantifiers.

We discuss our approach under the assumption that the query plan can be described as a tree. However XQuery also allows user-defined functions, and these functions can be recursive. Discussion of such recursive user-defined functions is beyond the scope of this paper.

In this paper, we focus on nested XQuery optimization with orderby clauses instead of complex XPath processing. Evaluation algorithms for complex XPath expressions having arbitrary navigation axes and node tests [10], [11] are orthogonal to XQuery decorrelation.

XAT Algebra: Our algebra (*XAT*) used in the RainbowCore project [26] expresses the subset of the XQuery language shown in Fig. 1. XAT is an order-preserving extension of the relational algebra designed to handle ordered XML data. For the purpose of decorrelation, this algebra is similar to NAL [16], SAL [3] and the algebra proposed in [18]. Hence our approach can be easily extended to these algebras.

Expr	::=	c //atomic constants \$var //visible variable (Errer, Errer) //sequence construction
		Expr/a :: n //navigation step (axis a, node test n)
		tag(Expr) //element constructor: tagger
		FLWOR //query block
		QExpr //expression with quantifier
		<i>CompExpr</i> //comparison expression for predicate
		OrderExpr //order-sensitive function. eg. position(
FLWOR	::=	$(For \mid Let)^+ [Where] \ [Orderby] \ return \ Expr$
For	::=	for \$var in Expr
Let	::=	let $var := Expr$
Where	::=	where Expr
Order by	::=	order by $Expr$
QExpr	::=	(some every) \$var in Expr satisfies Expr
CompExpr	::=	Expr CompOp Expr
		//CompOp is any comparison operator. eg. "="



We use the *XATTable* to represent ordered sequences of tuples. The input(s) and output of each operator are XATTables. An XATTable may contain nested tuples, that is, the content of an attribute may be a sequence of zero or more tuples.

Since XAT is not designed for type inference purposes, we only have two kinds of atomic values in an XATTable: the ID of an XML node and the string value of an XML node. We distinguish the ID based operations from the string value based operations. The XML data storage provides conversion functions from the node ID to the associated string value. For simplicity, we will not show such functions explicitly in our later discussions.

To define the order-preserving semantics of XAT operators, we will use a sequence abstraction of the XATTable. For an input XATTable R, h(R) denotes the first tuple (head) of the XATTable and t(R) denotes the remaining tuples (tail) of the XATTable. The symbol \oplus is used for the concatenation (ordered union) of two XATTables. The concatenation of XATTable columns is denoted by \circ . We define the algebraic operators recursively on their input XATTable(s). For binary operators, we use left hand side (LHS) and right hand side (RHS) to distinguish between the two input XATTables. We use ϵ to denote an empty XATTable.

The XAT algebra inherits all operators from the relational algebra, such as *Select* (σ_p), *Project* (Π_{Attr}), *Join* (\bowtie_p), *Left Outer Join* (LOJ, \ltimes), *Natural Join* (NJ, \bowtie), *Cartesian Product* (CP, \times), etc. Except for the addition of order preserving semantics, these operators have the similar semantics as in the relational context. Below we define the Cartesian Product of two XATTables as an example showing order preserving semantics. (Let $r_L = h(R_L)$).

$$R_L \times R_R := (r_L \overline{\times} R_R) \oplus (t(R_L) \times R_R), where$$
$$r_L \overline{\times} R_R := \begin{cases} \epsilon & if R_R = \epsilon \\ (r_L \circ h(R_R)) \oplus (r_L \overline{\times} t(R_R)) & otherwise \end{cases}$$

Other Join operators can be similarly defined by augmenting their corresponding relational counterparts with orderpreserving semantics. For the XQuery function *distinct-values()*, we introduce a value-based duplicate elimination operator *Distinct*. This operator is not order preserving and has semantics identical to its relational counterpart. We also define the operators: *Orderby* and *Position*. The Orderby operator sorts the tuples in the input XATTable by the string value of specified column(s). The Position operator gets the row number (beginning from 1) of each tuple and puts it as explicit value into a new column.

The XAT algebra also introduces new operators to represent the XQuery semantics, such as *Navigation* (ϕ_{xp}), *Tagger* (*Tag_{Pattern}*), *Nest* (*N*), *Unnest* (*U*), *Cat* (*C*), etc.

Since in this paper we do not focus on complex XPath processing, we use a "powerful" Navigation operator that can extract XML nodes and process XPath expressions over XML documents. We denote the Navigation operator as follows:

$$\phi_{\$col_j:xp(\$col_i)}(R) := (h(R) \times R_{Nav}) \oplus \phi_{\$col_j:xp(col_i)}(t(R))$$

where the schema of R_{Nav} is $\{col_j\}$, R_{Nav} is the sequence of extracted XML nodes from the XML node in col_i of h(R)by applying XPath processing.

The Tagger operator accepts a pattern indicating where and which open tags and close tags to add around the content of certain columns in the input XATTable.

Given a tuple with a sequence-valued attribute Attr, we define the Unnest operator as:

$$U_{Attr}(R) := (h(R)_{\vdash_{Attr}} \times R_{Attr}(h(R))) \oplus U_{Attr}(t(R))$$

where \vdash_{Attr} projects *out* the *Attr* column from *R* and $R_{Attr}(h(R))$ retrieves the sequence of attribute values in *Attr*. The Nest operator is a inverse of Unnest and can be defined accordingly.

The *Cat* operator concatenates multiple columns together to form a single column. This operator is used to merge pieces of XML separated by comma in the return clause of XQuery expressions.

To clarify the translation of FLWOR expressions into the XAT algebra, we introduce the *Map* operator. The Map operator is a binary operator with the LHS input XATTable defining the for-variable and the RHS defining an algebra expression *e*. The Map operator is defined as follow:

$$Map_{a:e(Attr)}(R) := (h(R) \circ a) \oplus Map_{a:e(Attr)}(t(R))$$

where the Attr denotes the for-variable in the FLWOR expression and a is the new attribute whose value is calculated from expression e for every instance of Attr.

The last operator discussed here is the *Groupby* (*GB*) operator, denoted as $GB_{col_i;col_j;op}(R)$. This operator is introduced mainly for the purpose of decorrelation. This GB operator is an extension of the groupby in the relational context. The Groupby operator will group the tuples of the input XATTable by the column col_i , then perform the operator op on col_i of each group of tuples, finally concatenate all the groups together as output. The Groupby operator can also group on multiple columns.

For further detailed discussion of the XAT algebra, please refer to our technical report [27].

XQuery Normalization: Prior to translating the XQuery expressions into the XAT algebra expression, we use a source-level normalization step applied to the original XQuery expressions. Similar normalizations are also discussed in [15]. Our normalization does not aim to do optimization of the XQuery, but rather provides a suitable format for easy generation of the XAT algebra tree.

Normalization Rule 1: The let-variables are treated as temporary variables. During normalization, they can be eliminated: the expression binding the let-variable is substituted for all occurrences of the let-variable. Note that in the implementation, the let-variable is calculated only once and is materialized for sharing among all the occurrences.

Normalization Rule 2: Since the *Map* operator is binary, the *For* clause defining more than one for-variable will be split into a sequence of nested For clauses. Each clause defines one for-variable only.

Translating Normalized XQuery Expressions to XAT Algebra: Normalized XQueries are translated into their corresponding XAT algebra representation in two steps: translating XPath expressions and translating the FWOR (without the Let clause) query expressions. As mentioned before, we simply translate each XPath expression into one *Navigation* operator.

The translation pattern of a flat FWOR query block to the XAT algebraic expression is illustrated in Fig. 2. A nested XQuery block can be translated recursively using this pattern. In this translation pattern, the *Map* operator introduces one for-variable from the for clause in the LHS expression. This for-variable can be referred to in the nested query blocks in the RHS. The *Nest* operator on top of the Map is used to construct a sequence of all intermediate results. For those *where* clauses where no position function is used, the where clause can also be put in the LHS of the Map operator, just like the orderby clause.



Fig. 2. Build Algebra Tree for XQuery FWOR Expression.

The algebraic operators are generated during the translation form an XAT algebra tree. We also allow the sharing of common subexpressions (e.g., the let-variable expression) among multiple operators. This turns the XAT tree into a DAG. In this paper, we do not emphasize the difference between them and just generally call them XAT tree.

IV. XQUERY DECORRELATION

After XQuery normalization and translation, the correlation in an XQuery expression is represented in the XAT tree by the Map operator and linking operators (operators in the RHS referring variables defined in the outer FLWOR query block in the inner query blocks). The Map operator introduces the for-variable from the LHS For clause and the linking operator refers to it in the RHS. Intuitively the Map operator forces a nested loop evaluation strategy. Hence, eliminating the nested loop iteration, that is, removing the Map operator in the XAT tree transformation is the main goal of the proposed decorrelation algorithm. Depending on the different semantics of the operators that the Map is pushed over, the Map operator will be pushed down along the RHS accordingly, until the linking operator is reached and the Map operator is rewritten as a join. As mentioned before, our techniques are an extension of magic decorrelation [20]. These extensions are sufficient to ensure efficient XQuery decorrelation. Please note that in this paper, we omit the detailed discussion about the empty collection issue - this is handled in the decorrelation algorithm by adding left outer joins. Since our example XQuery does not need left outer joins, we omit this step here. For the complete magic branch decorrelation algorithm, please refer to our technical report [27].

Below we will use the XQuery expression shown in the Sec. I as the running example. The generated XAT tree for the example query is shown in Fig. 3. The I_1, I_2 and I_3 blocks are generated from the outer query block. They represent the *orderby* clause, *for* clause and *return* clause respectively. Similarly the J_1, J_2, J_3 and J_4 blocks are generated for the inner query.

We now discuss how the different operators affect the "pushing down" of the Map operator. For this, we first distinguish between *tuple-oriented* and *table-oriented* operators. The propagation of the Map operator down over *tuple-oriented* operators is different from that over *table-oriented* operators.

Definition 1: A tuple-oriented operator is one that examines each tuple in the input XATTable(s) once at a time and generates a corresponding output tuple(s). A table-oriented operator, on the other hand, examines multiple and possibly all tuples in the input XATTable(s) for generating an output tuple(s).

The table-oriented operators in our algebra include: *Nest*, *OrderBy*, *Groupby*, *Distinct* and all relational aggregation functions. Since the order semantics in XQuery have to be



Fig. 3. The XAT Tree for the Example XQuery in Sec.1.

defined on a sequence of tuples, all order-sensitive operators such as *Position* are classified as table-oriented operators.

We show the *Position* operator below as an example of a table-oriented operator. The output of the *Position* operator depends on all the tuples in the input XATTable.

col_1	col_2	col_1	col_2	$position(col_2)$
a1	b1	a1	b1	1
a2	b2	a2	b2	2

For a tuple-oriented operator we can simply push the *Map* operator down over it. For table-oriented operators, we need to perform an extra rewriting for the operator. That is, we will generate a *Groupby* operator, which groups the input tuples by the for-variable introduced by the Map operator, and performs the original table-oriented operator for each group. Intuitively the added grouping operator separates the whole column used by the table-oriented operator into partitions according to the context variable. Thus each partition keeps the group boundary of the column correctly. We will show this decorrelation process in a step-by-step fashion below.

Step 1: Considering the Map operator of the inner query block, we simply push the Map operator down the RHS until we reach a table-oriented position operator. For the position operator, a Groupby operator is generated and the position function becomes the embedded operation of the Groupby operator. We then continue pushing down the Map operator until the RHS becomes empty and the Map operator can be removed. This step is shown in Fig. 4.



Fig. 4. Propagation of Map Operator for Inner Query Block

Step 2: Next we consider the Map operator of the outer query block in Fig. 3. We simply push the Map operator down the RHS until we reach a Nest operator. The Nest operator is another table-oriented operator. Propagation of the Map over the Nest operator is shown in Fig. 5.



Fig. 5. Propagation of Map Operator for the Outer Query Block

Step 3: Continuing to push the Map operator of the outer query block down, now the linking operator $\sigma_{ba=a}$ becomes the right child of the Map operator. The last step of the propagation is to absorb the Map operator into the linking operator. A Join is formed to connect both the branches. This transformation of the XAT tree is shown in Fig. 6.

Finally, the decorrelated XAT tree is shown in Fig. 7. The LHS of the Join operator retrieves a distinct sequence of authors ordered by their last names. The RHS of the Join operator retrieves the sequence of (book, author) ordered by the books' year. Here the *author* is the first author of each *book*. Note that the Groupby operator preserves the order since $\$b \rightarrow \by (there is one year for each book), and the input of the Groupby operator is a sequence sorted by the books' year.



Fig. 6. Propagation of Map Operator for the Outer Query Block (Cond.)

The Join operator produces a sequence of tuples with the major order of al and minor order of by. This ordered sequence will be grouped by a and all the book titles for each awill be nested into a collection. Since $a \rightarrow al$ (there is one last name for each author), this Groupby operator will also preserve the order of the sequence.



Fig. 7. The XAT of Example XQuery after Decorrelation.

V. MINIMIZATION OF XAT TREE

In this section, we study how to remove redundant operations in the XAT tree that has been generated by the above decorrelation approach. The goal is to rewrite it into an equivalent but smaller query plan with fewer number of operators.

In Fig. 7, a close inspection shows that the LHS and the RHS of the Join operator have similar XPath navigations to

the *author* node. But they use different Orderby operators: the authors in the LHS are ordered by their last names and the RHS is ordered by the books' year. Hence when we consider ordered semantics, the two sequences do not match. To share the same navigation among the LHS and RHS of the Join operator, we first need to rewrite the query plan by pushing down the navigation and pulling up the orderby operator.

Beyond sharing of the XPath navigation, we find that since the Join is an equi-join on the shared XPath navigation (b = ba), the Join can even be removed. Below we will discuss these two types of rewritings in more detail.

A. Order Preserving Property of XAT

As mentioned before, the XAT algebra is an order preserving algebra. Depending on how the tuple order of the input XATTable is changed by the operator and reflected in the output, the XAT operators can be divided into four categories: order keeping, order generating, order destroying and order specific operators.

- Order-keeping operators include most of the operators, such as Select, Project and Tagger. For example, the tuple order among the input tuples of the Select operator will be kept in the output XATTable. Project and Tagger operators will behave similarly. Here the Project operator in XAT does not include the distinct semantics.
- Order-generating operators include the Orderby, Navigate and the binary operators. The Orderby operator will sort the input tuples by certain column(s). The Navigate operator will extract the document order of the elements of navigation and imposes it into the respective orders of the tuples it generates. The binary operators like Join operator will merge the order from its two branches below into a new order.

For the Navigate operator, the tuple order among the input tuples will be kept in the output XATTable as shown below. The extracted document order will be the minor order. Suppose variable \$a has two instances of $\{a_1, a_2\}$. For Navigate a/b, a_1 has children $\{b_1, b_2\}$ while a_2 has the child $\{b_3\}$. The input and output XATTable are:



Note that different permutations of the same set of Navigates may result in different tuple orders. For example, considering two Navigates from a: a/b and a/c, if we perform a/b first, then the final tuple order will be determined first by a, second by a/b and third by a/c. If we perform the two Navigates the other way, the output tuple order will be different. Such rewriting will be incorrect for ordered semantics.

The binary operators (like Join and Cartesian Product) can merge the tuple order from both branches below. The

tuple order of the LHS input XATTable will be used as the major order while the order of the RHS input XATTable will be used as the minor order in the output XATTable.

- **Order-destroying** operators include the Distinct operator. The value-based Distinct operator will destroy the order of the input tuples. The output tuple order for Distinct is undefined.
- Order-specific operators include the Groupby operator in some cases, the Groupby operator acts as an orderkeeping operator and in other cases, it acts as an orderdestroying operator. If the input tuples have been sorted on a column (\$b) and the grouping is done on a column (\$a), where \$a → \$b, then the Groupby operator preserves this order. Otherwise the order in the input XATTable is destroyed. In this case here, \$a, \$b can even be multiple columns.

B. Finding the Minimal Order Context

The XAT tree may include operators having various order preserving properties. In order to perform algebraic rewriting correctly keeping the ordered semantics, we first propose a systematic way to determine the minimal ordered semantics.

This process includes two steps: a bottom-up tree traversal recording the order context of the XATTable; and a top-down tree traversal removing any overwritten order contexts. After this process, every intermediate XATTable will be associated with an ordered sequence, denoting the order context by XATTable columns. We denote the order context sequence as $[\$col_{D[S]}, ...]$ for the XATTables. The subscript D denotes the document order and S stands for sorted value based order.

We show these two steps using the previous XAT tree in Fig. 8, that is, with the partial XAT tree that is sufficient for the purpose of explanation. The left part shows the bottom-up step and the right part the top-down step. In the first step, the order context of the XATTable is generated according to the order-preserving property of each operator. In the second step, all the order context columns overwritten by upper operators will be removed. Thus the result order context associated with the XATTables after the process describes the minimal ordered semantics in the XAT tree. These order contexts must be kept during the correct algebraic rewriting.

In the example query plan, there are two implicit functional dependencies coming from the Orderby clause: $a \rightarrow al$ and $b \rightarrow by$. Otherwise the two Orderby clauses in the example XQuery expressions would be ambiguous. Since $b \rightarrow by$, the Groupby operator grouping on b will preserve the sorted order from by.

C. Orderby Pull up

Correct query rewriting under ordered semantics must guarantee that the order context of the result XATTable will not



Fig. 8. The Process of Finding the minimal Order Context.

change after rewriting. To achieve this, we first define the correct rewriting of XAT trees below.

Definition 2: For an XAT tree, suppose the minimal order contexts of the output XATTable of the root of the tree be C. If C remain unchanged after a certain rewriting inside the tree, we call such rewriting an order preserving rewriting.

Intuitively, pulling up the Orderby operator over an orderkeeping operator is always allowed. Pulling over an ordergenerating operator is prohibited, since the upper Orderby operator can overwrite the lower Orderby operators. For the order-destroying operators, the lower Orderby operator can be removed. For the order-specific Groupby operator, we need to check the tuple order and the grouping column in order to make a correct rewrite.

We have the following four rewriting rules for the pulling up of the Orderby operator.

Rule 1: An Orderby operator and its associated navigation operator (if any), which retrieves the column sorted on, can be pulled up together over a unary order-keeping operator.

Rule 2: Consider pulling up the Orderby operator above a binary order-generating operator \$*o*.

- If the LHS of \$*o* is ordered by \$*l* and the RHS of \$*o* is not ordered, then the Orderby operator can be pulled up.
- If the RHS of \$*o* is ordered by \$*r* but the LHS of \$*o* is not ordered, then the Orderby operator cannot be pulled up.
- If the LHS of \$*o* is ordered by \$*l* and the RHS is ordered by \$*r*, then both Orderby operators in the LHS and RHS can be pulled up and merged into one single Orderby operator. This new operator sorts the XATTable using \$*l* as the major order and \$*r* as the minor order.

Rule 3: An Orderby operator can be removed if there is an order-destroying operator above it.

Rule 4: An Orderby operator that sorts on b can be pulled above a Groupby operator that groups on a if $a \to b$.

While Rules 1, 3 and 4 are straightforward, we illustrate the three cases of Rule 2 using the Join operator in Fig. 9.



Fig. 9. The Three cases of Rule 2.

Proposition 1: A series of algebraic query rewritings using Rules 1, 2, 3 and 4 in XAT trees form a rewriting that is globally order preserving.

In Fig. 10, the Orderby in the LHS of the Join can be pulled up above the Project, since the Project is a unary order-keeping operator. The Orderby in the RHS can also be pulled up above the Project, Groupby and Select. For the Groupby operator, since the Orderby operator sorts the tuples by by, which is functionally dependent on the grouping column b, the tuple order before and after the pulling up of the Orderby operator are identical. The LHS and the RHS Orderby operators can be pulled up above the Join and be merged into one single Orderby operator that sorts tuples by al (major),by (minor).



Fig. 10. Orderby Pull up

After pulling up the Orderby operators, the XQuery minimization problem is reduced from the ordered sequence matching problem to the well studied XPath matching under set semantics. To "gather" all the XPath expressions, we push down all the navigations to the bottom of the XAT tree. During this pushing, the Project operator needs to be changed accordingly as shown in Fig. 10.

D. XPath Matching and Redundance Removing

In the example XAT tree, after pulling up the Orderby operators, the order context becomes null for the two branches below the Join operator. Then the optimization problem reduced to the unordered semantics. Various query plans can be generated and the optimal can be picked.

By utilizing existing XPath matching algorithms [2], we can easily find that the a in the LHS of the Join operator and the ba in the RHS both come from the same XPath expression bib.xml/book/author. We can remove such redundant navigation using the following rewriting rule.

Rule 5: Consider an equi-join operator with a = b where a introduced from the LHS and b from the RHS. We can remove the equi-join and the LHS if the following conditions hold:

- $b \subseteq a$ under set semantics, and
- Only the join column \$a appears in the LHS's schema, and
- a is a set with no duplicates.



Fig. 11. Removing Redundant Join and Navigations.

In Fig. 11, every author in ba appears in a; the schema of the LHS has only one column a; and a has no duplicates after the Distinct operator. Therefore the equi-join operator and in fact the complete LHS branch can be removed. The final query plan is shown in Fig. 12.

VI. EXPERIMENTAL STUDY

We have conducted preliminary experiments to illustrate the performance gains achieved by our approach. We have implemented the magic branch decorrelation and minimization



Fig. 12. The optimized XAT of the example XQuery.

algorithm in the RainbowCore project, a native XQuery engine based on the XAT algebra developed at WPI [26].

Our preliminary experimental results based on the example XQuery described in Sec. I are shown in Fig. 13. These experiments were performed on a 1.2GHz PC with 512MB of RAM running Windows 2000. We compare the query execution times among three query plans: the original translated query plan with nested subquery shown in Fig. 3; the decorrelated query plan shown in Fig.7; and the optimized query plan after removing redundant navigations and Join depicted in Fig.12. We have varied the input XML documents to have different numbers of book elements. The results are shown in Fig. 13.



We can see that the decorrelation step gives significant performance gains. One of the reasons is that in our experiment we do not employ any storage manager, so the navigations will be launched directly to the file for every instance of the LHS of the Map operators. After decorrelation, this repeated navigation in the subquery will be saved and the total I/O cost will decrease dramatically. On the other hand, the XAT minimization also brings significant performance improvements in the order of 20%-30%. This is due to the successful removal of the redundant navigations and the costly Join operation. The performance gain of the XAT minimization is also shown in Fig. 14.



VII. CONCLUSION

In this paper we propose an algebraic rewriting technique of nested XQuery expressions containing explicit orderby clauses. The proposed technique is based on the principles of magic decorrelation. Unlike prior work, this technique enables the optimization of nested XQuery expressions not only with set but also with ordered sequence semantics. We illustrate how our proposed technique is able not only to successfully

now our proposed technique is able not only to successfully tackle the same XQuery logical optimization problem solved in the NEXT framework, but to go one step beyond and now also support ordered semantics. Our work extends previous work primarily in two aspects.

First, to the best of our knowledge, we are the first to provide a practical approach handling XQuery logical minimization with sequence semantics. Second, our magic branch approach inherits the advantages of magic decorrelation and opens the opportunities for further optimizations. The preliminary experimental studies illustrate the effectiveness of the proposed algorithm. As part of our future work, we plan to study the order inference of different operators in order sensitive query plans as well as optimization of the operators using it.

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