# Towards a unified model for heterogeneous data 

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## Introduction

■ In a growing number of applications the classic relational model captures only a fraction of relevant data.

- Biological databases.
- XML data/document repositories.
- The World Wide Web.
- Multimedia data repositories.
- Specialized systems, models, and theories are available, customized to specific kinds of data.
- It is not unusual to have applications based on combinations of these systems.


## Introduction

- In the (not so far) future, everything about our life will be stored in a (not very large) database [2].
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## Introduction

- The objective is to have a single system storing heterogeneous data, and providing unified and homogeneous representation and manipulation functionalities.
■ Existing system are already providing support for heterogeneous data.
- For instance, many information systems manipulate mixed XML and relational data.


## The case of XML data

First main approach: Adaptation.

- Trees are converted to tables, and vice versa.

■ SQL/XML (Oracle, DB2), FOR XML clause (SQL Server).


## Adaptation

- XML-enabled systems readily available.
- Usable if the difference is more on the format than on the model.


## The case of XML data

Second main approach: Rethinking.

- New ad hoc systems.
- Tamino, eXist, Galax.



## Rethinking

■ It needs time (more suited to academics and small applications than commercial/critical systems).

- It promises better results.
- At the end, many functionalities are not substantially different from those found in traditional systems $\rightarrow$ We would like to identify and change only those features that are specific to XML.


## The case of XML data

Third main approach: Extension.
■ New complex types are defined.

- Oracle's XML Type.



## Extension

- Good choice to take care of object heterogeneity.
- Still constrained to be embedded into non-flexible relational structures.
- Very useful when the new data is not much structured.
■ Otherwise, we must reimplement database functionalities inside the objects (=Rethinking).


## Some basic considerations (I)

- There are operations which cannot be described by a simple, general, and compact model, as they are meaningful only when applied to particular kinds of data.
■ For instance, the extraction of a color histogram from an image.
- Therefore, a model for heterogeneous data cannot describe everything, and must hide the details about elementary pieces of data.
■ The level of detail is not absolute, but it depends on our requirements.


## Some basic considerations (II)

- There is a (limited) number of aggregation patterns for elementary kinds of data.



## Some basic considerations (III)

- There are operations that we can nearly always perform on collections of data, and that can be modeled aside from its peculiarities.
■ 'Give me all O where P.'
- 'Give me all Web Pages where the Title is "home page".'
■ 'Give me all Tuples where the Identifier is '001'.'

■ 'Give me all Images where the prevalent color is Green.'

## Overview of the Model

DATABASE ARCHITECTURE


- 3-level architecture of (relational) databases.
- We re-define the logical level.


## Overview of the Model



■ Collections are sets, multisets, lists of objects.

- For example, relations are sets of tuples.


## Overview of the Model



■ Objects are aggregations of atoms.

- Objects can be tuples, trees, graphs.


## Overview of the Model



- Atoms hide data heterogeneity.


## Overview of the Model



■ The model instantiates to XQuery Sequences.

## Overview of the Model



- The model instantiates to Relational Tables.


## Overview of the Model



■ The model instantiates to TAX Collections.

## Overview of the Algebra



■ Ex: $\sigma_{P}(C)=\{c \mid c \in C \wedge P(c)\}$
■ Based on abstract properties of the parameters.

- P returns true if an object $c$ satisfies some contraints, false otherwise.
- We want to define the algebra without specifying $P$ and other object-dependent parameters.


## Overview of the Algebra



- A few kinds of parameters are enough to define the external algebra (SP,PF,EF,SF,NM).
- The intermediate language manipulates the internal structure of single objects (Ex: XPath).


## Overview of the Algebra



- Atomic functionalities depend on the type of the atoms.


## Overview of the Algebra



## Expected Advantages

- For each layer, development of specific optimization techniques.
- To manipulate large sets of objects.
- To navigate XML trees.
- To manipulate atoms (images, media, text).
- Easy extension of the system.
- To add support for atomic types.
- To add support for tuples, trees, graphs, and other aggregation patterns.


## Parametric Algebra

- Relational Algebra (RA) works well with relational data.
- As the relational model is a specific case of ours, our parametric algebra should reduce to RA.
- Therefore, we use RA as a starting point to define our algebra.
- We first generalize its operators, then define new operators for missing functionalities.


## Parametric Algebra

- $\sigma$ and $\pi$ are two basic functionalities borrowed by the relational context.



## Parametric Algebra

- $\sigma$ selects some of the objects in a collection.



## Parametric Algebra

- $\pi$ extracts part of the objects.



## Parametric Algebra

- The opposite of projection is embedding ( $\epsilon$ ).
- Information to construct new data provided as a parameter of the operator.



## Parametric Algebra

- As objects are not supposed to be elementary, we also need a grouping operator $(\gamma)$.



## Parametric Algebra

- The opposite of a grouping is a splitting ( ( ) .



## Parametric Algebra

- Finally, we have binary operators, to combine two collections.
■ $\cup, \bowtie,-$
- Some other operators cannot be defined until we instantiate objects, as they change their internal organization.
- We call them presentation operators.


## Algebraic Equivalences

- The operators presented in the last few slides make little assumptions on the internal organization of objects.
- As a consequence, we can define abstract equivalences.
■ We present three examples of equivalences concerning the selection operator.


## Algebraic Equivalences

- Some equivalences are generalizations of the relational ones.
- Ex: Pushing selections down into joins.

$$
\begin{aligned}
& \quad \sigma_{\mathrm{P}}\left(C_{1} \bowtie_{P^{\prime}} C_{2}\right)=C_{1} \bowtie_{P^{\prime}} \sigma_{\mathrm{P}}\left(C_{2}\right) \\
& \text { if } \forall c^{\prime} \in C_{1}, c^{\prime \prime} \in C_{2}\left(\mathrm{P}\left(c^{\prime} \cup c^{\prime \prime}\right)=\mathrm{P}\left(c^{\prime \prime}\right)\right) .
\end{aligned}
$$

- P is a selection predicate (Ex: book/author='Shelley'), $C_{1}, C_{2}$ are collections.
- The condition specifies that $P$ does not depend on the objects in $C_{1}$.


## Algebraic Equivalences

- Some equivalences are relational-like, but applied to new operators.
■ Ex: Inversion of selection and embedding.

$$
\begin{gathered}
\sigma_{\mathrm{P}}\left(\epsilon_{\mathrm{FE}}(C)\right)=\epsilon_{\mathrm{FE}}\left(\sigma_{\mathrm{P}^{\prime}}(C)\right) \\
\text { if } \forall c \in C\left(\mathrm{P}(\mathrm{FE}(c))=\mathrm{P}^{\prime}(c)\right) .
\end{gathered}
$$

- FE specifies how to construct new data.
- With XML data, it corresponds to XQuery node constructors.


## Algebraic Equivalences

- Some equivalences are specific for the new operators:
■ Ex: Pushing selections down into splittings.

$$
\begin{aligned}
& \quad \sigma_{\mathrm{P}}(\varsigma(C))=\varsigma\left(\pi_{\mathrm{FP}}(C)\right) \\
& \text { if } \forall c \in C(\operatorname{FP}(c)=\{e \mid e \in c \wedge \mathrm{P}(\{e\})\}) .
\end{aligned}
$$

- FP is a projection function, specifying the part of the objects to be extracted.


## A Concrete Example: XML/Relational Data Management

## Objective

■ Model for mixed XML/Relational data, as an instantiation of our abstract model.

- Homogeneous representation.
- The query algebra must support (significant subsets of) the main user languages.



## Roadmap

- Parametric Algebra $\rightarrow$ Algebra for Mixed Data.
- To instantiate it, we must:
- Define objects (the entities composing objects).
- Define entity manipulation functions (we will use simple atoms).
- Define application-specific presentation operators.


## Entities: Data Trees

- An Object is a set of entities called Data Trees.
- A Collection is a set of Data Forests (Objects).
- A Data Forest can represent a Tuple with XML Trees.


## Entities: Data Trees

1. $V=\left\{v_{1}, \ldots, v_{n}\right\}$ is a finite set of vertices.
2. $E \subset\left\{\left(v_{i}, v_{j}\right) \mid v_{i}, v_{j} \in V\right\}$.
3. $(V, E)$ is a directed tree.
4. $\preceq$ is a possibly empty partial order on $V$.
5. $\lambda: V \rightarrow(L \cup\{$ null $\})$, where $L$ is a set of labels.
6. $\tau: V \rightarrow T$, where $T$ is a set of types.
7. $\forall v \in V\left(\delta(v)=\left\{\begin{array}{ll}\oplus(c(v)) & \text { if outdegree(v) } \geq 1 \\ \delta^{\prime}(v) & \text { o.w. }\end{array}\right)\right.$

- $\oplus$ is a parametric concatenation operator, $c(v)$ is the set of $v^{\prime} s$ children, and $\delta^{\prime}$ is a content function defined on leaf nodes.


## Objects (Examples)

## - Relational Tuple:



## Objects (Examples)

## ■ XML Tree:



## Objects (Examples)

- Mixed Data:



## Predicates and Functions

- The parametric definition of our algebraic operators allows us to choose many languages to manipulate data forests.
- We need to define Object Manipulation Functions (SP, PF, EF, SF, NM).


## P\&F: Tree Selection Expressions

■ Used to select the root nodes of data trees.

- $x \in \Sigma$ is a tree selection expression (TSE).
- $(\phi, \phi)$ is a TSE if $\phi$ is a TSE.
- $\bar{\phi}$ is a TSE if $\phi$ is a TSE.

Input:
$F$ :


Trees with root $F$

## P\&F: Node Markers



## P\&F: Projection Functions

Input:
$-A / *:$
$+A / / B:$


Deletes children of $A$


Extracts B descendants of A

## P\&F: Embedding Functions



## Presentation Operators

- To complete the algebra instantiated by the predicates and functions just defined, we still need presentation operators.
- Looking at the definition of data trees, we can identify two missing operators, used to change order and labels.
- Renaming ( $\rho$ ), changes node and column names.
- Ordering ( $\omega$ ), changes the relative order of nodes.


## SQL/XML

- Conservative extension of SQL, augmented with functions that build XML data [3].
■ We focus on a subset of SQL/XML that includes the two basic functionalities of the language:
- XMLELEMENT()
- XMLAGG()


## SQL/XML (Example)

SELECT XMLELEMENT(NAME "dep", XMLELEMENT(NAME "name",dep), XMLAGG(XMLELEMENT(NAME "emp",id))
) AS result
FROM EMP
GROUP BY dep

$$
\begin{gathered}
\rho_{\text {result }-\$ 2}\left(\pi _ { + \$ 2 } \left(\pi _ { - \$ 2 / \text { dep } / * } \left(\epsilon_{<\$ 2>(<\text { dep }>(\$ 3, \$ 0))}( \right.\right.\right. \\
\pi_{-\$ 3 / \text { name } / *}\left(\epsilon_{<\$ 3>(<\text { name }>(+ \text { dep }))}\right)\left(\gamma _ { \text { dep } } \left(\pi _ { - \$ 0 / * } \left(\epsilon_{<\$ 0>(\$ 1)}( \right.\right.\right. \\
\pi_{-\$ 1 / \text { emp } / *}\left(\epsilon_{<\$ 1>(<\text { emp }>(+ \text { id }))}\right)
\end{gathered}
$$

## SQL/XML (Example)

## EMP



## SQL/XML (Example)

$$
\pi_{-\$ 1 / \mathrm{emp} / *}\left(\epsilon_{<\$ 1>(<\mathrm{emp}>(+\mathrm{id}))}(.)\right)
$$



## SQL/XML (Example)

$$
\gamma_{\mathrm{dep}}\left(\pi_{-\$ 0 / *}\left(\epsilon_{<\$ 0>(\$ 1)}(.)\right)\right)
$$



## SQL/XML (Example)

$$
\pi_{-\$ 3 / \text { name } / *}\left(\epsilon_{<\$ 3>(<\text { name }>(+ \text { dep }))}(.)\right)
$$



## SQL/XML (Example)

$$
\pi_{-\$ 2 / \operatorname{dep} / *}\left(\epsilon_{<\$ 2>(<\operatorname{dep}>(\$ 3, \$ 0))}(.)\right)
$$



## SQL/XML (Example)

$$
\rho_{\text {result } \leftarrow \$ 2}\left(\pi_{+\$ 2}(.)\right)
$$



## Conclusion

- Data modeling: making it both generic and easily specializable is one of the main challenges.
- Parametric logical level that generalizes the main existing logical models.
- Application of the model to XML and Relational data.
- Some missing features:
- Constraints.
- Mapping to physical level.


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## Additional Slides

- A step-by-step XQuery example.

■ An example using Oracle XMLType.
■ Other XQuery examples.

- Input and Path Expressions.
- FLWR Expressions.
- Constructors.
- A Complex Example.
- Grammars.
- A Subset of SQL/XML.
- A Subset of XQuery.


## XQuery

- W3C proposal for an XML query language [1].
- We focus on a subset of XQuery that includes:
- Simple path expressions.
- For-Let-Where-Return expressions.
- Constructors.
- Arbitrarily nested sub-queries.


## XQuery (Example)

for $\$ \mathrm{~b}$ in collection('books') let \$c := \$b/ / chapter where $\$ \mathrm{~b} /$ title $={ }^{\prime}$ XQuery' return \$c/title

$$
\begin{aligned}
& \epsilon_{<\$ \mathrm{c}>(\overline{\mathrm{\$ b}})}\left(\pi _ { + \$ \mathrm { b } ; \mathrm { pb } / * / / \text { chapter } } \left(\epsilon_{<\$ \mathrm{bb}>(*)}( \right.\right. \\
& \left.\left.\left.\left.\left.\left.\varsigma\left(\operatorname{IN}_{\text {books }^{\prime}}([])\right)\right)\right)\right)\right)\right)\right)
\end{aligned}
$$

## XQuery (Example)

$\mathrm{IN}_{\text {books }}{ }^{\prime}([])$


## XQuery (Example)

$$
\epsilon_{<\$ b>(*)}(\zeta(.))
$$



## XQuery (Example)

$$
\epsilon_{<\$ \mathrm{c}>(\overline{\$ \mathrm{~b}})}\left(\pi_{+\$ \mathrm{~b} ; \$ \mathrm{~b} / * / / \text { chapter }}(.)\right)
$$



## XQuery (Example)

$$
\sigma_{\$ \mathrm{~b} / * / \text { title }=^{\prime} \text { XQuery }}(.)
$$



## XQuery (Example)

$$
\gamma\left(\pi_{+} \overline{\$ c, \$ \mathrm{bb}}\left(\pi_{+\$ c ; \$ \mathrm{~b} ; \$ \mathrm{c} / * / \text { title }}(.)\right)\right)
$$



## XMLType

Consider the following Oracle $10 g$ SQL statements:
create table DEPS_AND_EMPS(XDATA sys.XMLTYPE);
create table DEP_INFO(Name VARCHAR2(10), Info VARCHAR2(80));

## XMLType

## select D.XDATA.extract('/dep/name') .getClobVal() <br> from DEPS_AND_EMPS D where D.XDATA.extract('/dep/id/text()') .getStringVal() = '0001';

## $\pi_{\text {XDATA } / \text { dep } / \text { name }}\left(\sigma_{\text {XDATA } / \text { dep } / \mathrm{id} / *=^{\prime} 0001^{\prime}}(\mathrm{D})\right)$

## XMLType

# select D.XDATA, I.Info from DEPS_AND_EMPS D, DEP_INFO I where D.XDATA.extract('/ dep/name/text()') .getStringVal() = I.Name; 

$\pi_{\text {XDATA,Info }}\left(\mathrm{D} \bowtie_{\text {XDATA }} /\right.$ dep $/$ name $/ *=$ Name $\left./ * \mathrm{I}\right)$

## Input and Path Expressions

doc('bib.xml')/ /author/surname $\pi_{+* / / \text { author } / \text { surname }}\left(\operatorname{IN}_{\text {bib.xml }}([])\right)$

## FLWR Expressions

for $\$ \mathrm{~b}$ in collection('books')
let $\$ \mathrm{a}:=\$ \mathrm{~b} /$ / author where \$b/title/* = 'Moby Dick' return \$a

$$
\begin{aligned}
& \gamma\left(\pi _ { + \overline { \$ a , \$ b } } \left(\pi _ { + \$ \mathrm { a } ; ; \mathrm { sb } ; \$ \mathrm { a } / * } \left(\sigma_{\$ \mathrm{bb} / * / \text { title } / *=^{\prime} \text { Moby Dick }^{\prime}( }\right.\right.\right. \\
& \epsilon_{<\$ \mathrm{a}>\overline{\mathrm{sb}})}\left(\pi_{+\$ \mathrm{~b} ; \$ \mathrm{~b} / * / / \text { author }}( \right. \\
& \left.\left.\left.\left.\left.\epsilon_{<\$ b>(*)}\left(\varsigma\left(\operatorname{IN}_{\text {books }^{\prime}}([])\right)\right)\right)\right)\right)\right)\right)
\end{aligned}
$$

## Constructors

<greetings>
Hello < planet \(>\) World \(</\) planet \(>\)
</greetings>
$\epsilon_{<\text {greetings }>\left({ }^{\prime} \text { Hello }^{\prime}, \$ 0\right)}^{-}\left(\epsilon_{<\$ 0>(*)}\left(\epsilon_{<\text {planet }>\left({ }^{\prime} \text { World' }\right)}([])\right)\right)$

## A More Complex Example

for \$a in collection('Authors')
return
<author>
\$a/name
\{for \$b in collection('Books')
where $\$ \mathrm{~b} /$ author $/ *=\$ \mathrm{a} / \mathrm{id} /$ *
return $\$ \mathrm{~b} /$ title \}
\{for $\$ \mathrm{j}$ in collection('Journals')
where $\$ \mathrm{j} /$ author $/ *=\$ \mathrm{a} / \mathrm{id} / *$
return \$j/title\}
</author>

## A More Complex Example

$\gamma\left(\pi_{+\overline{\$ a}}\left(\epsilon_{<\text {author }>(\prime \hookleftarrow}^{-} \quad \$ a /\right.\right.$ name $\left.\hookleftarrow \quad \prime, \$ 0,{ }^{\prime} \hookleftarrow \quad, \$ 1,{ }^{\prime} \hookleftarrow \prime\right)\left(\epsilon_{<\$ 1>(\overline{\$ a,}}\right.$内 (
$\gamma_{\$ \mathrm{a}, \$ 0}\left(\pi_{+\overline{\$ j}}\left(\pi_{+\$ \mathrm{j} ; \$ 0 ; \$ \mathrm{a} ; \$ \mathrm{jj} / * / \text { title }}\left(\sigma_{\$ \mathrm{jj} / * / \text { author } / *=\$ \mathrm{a} / * / \mathrm{id} / *}\left(\epsilon_{<\$ j}\right.\right.\right.\right.$
$\zeta_{\$ \mathrm{a}, \$ 0}\left(\mathrm{IN}_{\mathrm{JJournals}^{\prime}}\left(\epsilon_{<\$ 0>(\overline{\$ \mathrm{a}})}((\mathrm{B} 2)=\bowtie\right.\right.$
$\left(\gamma_{\$ \mathrm{a}}\left(\pi_{+\overline{\mathrm{b}}}\left(\pi_{+\$ \mathrm{~b} ; \$ \mathrm{a} ; \$ \mathrm{~b} / * / \text { title }}\left(\sigma_{\$ \mathrm{~b} / * / \text { author } / *=\$ \mathrm{a} / * / \mathrm{id} / *( }\right.\right.\right.\right.$
$\left.\left.\epsilon_{<\$ \mathrm{~b}>(\overline{\$ \mathrm{a}})}\left(\zeta_{\$ \mathrm{a}}\left(\mathrm{IN}_{\text {'Books }^{\prime}}\left(\epsilon_{<\$ \mathrm{a}>(*)}\left(\zeta\left(\operatorname{IN}_{\text {'Authors }^{\prime}}([])\right)\right)\right)\right)\right)\right)\right)$

## Grammar of a SQL/XML Subset I

CompilationUnit : := SelectStatement ";" TableColumn : : = Name ( "." Name )?
Name : : = ( <S_IDENTIFIER> | <S_QUOTED_ID> ) TableReference : : = Name SelectStatement $::=$ "SELECT" SelectList

FromClause ( WhereClause )? ( GroupByClause ) SelectList $::=(" * " \mid$ SelectItem ("," SelectItem )* )
SelectItem : : = (SQLPrimaryExpression XMLElement|XMLAgg) (As)?
As : : = "AS" <S_IDENTIFIER>
FromClause : := "FROM" TableReference ( ", " TableReference )*
WhereClause : := "WHERE" SQLExpression

## Grammar of a SQL/XML Subset II

GroupByClause ::= "GROUP" "BY" TableColumn ( "," TableColumn )*
SQLExpression ::= SQLComparisonExpr
( "AND" SQLComparisonExpr )*
SQLComparisonExpr::= SQLPrimaryExpr <Relop> SQLPrimaryExpr
SQLPrimaryExpr ::= (TableColumn | <S_NUMBER> | <S_CHAR_LITERAL>)
XMLElement ::= "XMLELEMENT (NAME" <S_QUOTED_ID> "," ElementContent ("," ElementContent)* ")" ElementContent $::=$ (Name | XMLElement | XMLAgg <S_CHAR_LITERAL>)
XMLAgg : : $=$ "XMLAGG(" XMLElement ( ","
XMLElement )* ")"

## Grammar of an XQuery Subset I

Expr ::= InputExpr | FLWORExpr | Literal | Constructor
InputExpr ::= (InputFunctionCall | VarRef) (PathExpr)?
InputFunctionCall ::= ("doc(" | "collection(") <StringLiteral> ")"
VarRef ::= <VarName>

| Expr : := ( ChildStep | DescendantStep ) |
| :---: | :---: |
| ( ChildStep | DescendantStep )* |

ChildStep ::= "/" NameTest
DescendantStep ::= "//" NameTest
NameTest : := <QName> | "*"
FLWRExpr ::= (ForClause | LetClause)+ (WhereClause)? "return" Expr

## Grammar of an XQuery Subset II

ForClause ::= "for" <VarName> "in" Expr LetClause ::= "let" <VarName> ":=" Expr WhereClause ::= "where" Expr <CompOp> Expr Constructor : : = "<" <TagQName> ("/>" (">" ElementContent* "<" <TagQName> ">"))
ElementContent ::= <ElementContentChar> Constructor | EnclosedExpr
Literal ::= NumericLiteral | <StringLiteral> NumericLiteral ::= <IntegerLiteral> <DecimalLiteral> <DoubleLiteral>
EnclosedExpr ::= "\{" Expr "\}"

## References

[1] Scott Boag, Don Chamberlin, Mary F. Fernández, Daniela Florescu, Jonathan Robie, and Jérôme Siméon. XQuery 1.0: An XML query language (working draft, nov 12, 2003). Technical report, W3C, 2003. http://www.w3.org/TR/xquery/.
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[3] Jim Melton. SQL - part 14: SQL/XML. Technical report, ISO/ANSI, 2003.

