## Simplifying XML Schema: Effortless Handling of Nondeterministic Regular Expressions

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## XML Schema

## XML Schema is ...

- A language for defining the structure of XML documents.
- W3C Standard
- Successor of DTD


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Why a schema for XML documents?

- Provides semantics to the data
- Very useful for optimization
- Necessary for data integration
- ...


## XML Schema: Abstract Syntax

```
XSD
<xsd:element name="store" type="store"/>
<xsd:complexType name="store">
    <xsd:sequence>
        <xsd:element name="order" type="order" minOccurs="0" maxOccurs="unbour
        <xsd:element name="stock" type="stock"/>
    </xsd:sequence>
</xsd:complexType>
<xsd:complexType name="order">
    <xsd:sequence>
        <xsd:element name="customer" type="customer"/>
            <xsd:element name="item" type="item1" minOccurs="1" maxOccurs="unbounc
    </xsd:sequence>
</xsd:complexType>
```

$$
\begin{aligned}
\text { root } & \rightarrow \text { store } \\
\text { store } & \rightarrow \text { order }^{*} \text { stock } \\
\text { order } & \rightarrow \text { customer item }
\end{aligned}
$$

## XML Schema

## XSD

| root | $\rightarrow$ store | stock | $\rightarrow$ item |  |
| ---: | :--- | :--- | :--- | :--- |
| sto |  |  |  |  |
| store | $\rightarrow$ order* stock $^{\text {item }}$ | $\rightarrow$ | id price |  |
| order | $\rightarrow$ customer item $_{1}^{+}$ | item $_{2}$ | $\rightarrow$ | id qty |

## XML Document: Tree



## XSD Validation

## XSD

$$
\begin{array}{rllll}
\text { root } & \rightarrow \text { store } & \text { stock } & \rightarrow \text { item } \\
\text { store } & \rightarrow \text { order }^{*} \text { stock } & \text { item } & \rightarrow & \text { id price } \\
\text { order } & \rightarrow \text { customer item } & \text { item } & \rightarrow & \text { id qty }
\end{array}
$$

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## XSD Validation

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\begin{array}{rlll}
\text { root } & \rightarrow \text { store } & \text { stock } & \rightarrow \text { item } \\
\text { sotore } & \rightarrow \text { order* } \text { stock } & \text { item } & \rightarrow \text { id price } \\
\text { order } & \rightarrow \text { customer item } & \text { item } & \rightarrow \text { id qty }
\end{array}
$$

## XML Document: Tree



## XSD Validation

## XSD Validation

| root | $\rightarrow$ store | stock | $\rightarrow$ | item |
| ---: | :--- | :--- | :--- | :--- |
| 2 |  |  |  |  |
| store | $\rightarrow$ | order* $^{*}$ stock | item | $\rightarrow$ |
| id price |  |  |  |  |
| order | $\rightarrow$ | customer item |  |  |
| 1 | item $_{2}$ | $\rightarrow$ | id qty |  |

## XML Document: Tree



## XSD Validation

## XSD Validation

$$
\begin{array}{rllll}
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\text { store } \\
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\text { order } & \rightarrow \text { customer item } & \text { item } & \rightarrow & \text { id qty }
\end{array}
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\text { store } & \rightarrow & \text { order }^{*} \text { stock } & \text { item } & \rightarrow \\
\text { id price } \\
\text { order } & \rightarrow & \text { customer item } & 1 & \text { item } \\
2 & \rightarrow & \text { id qty }
\end{array}
$$

## XML Document: Tree



## XSD Validation

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$$
\begin{array}{rllll}
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\text { store } & \rightarrow & \text { order } \\
\text { stock } & \text { item } & \rightarrow & \text { id pric } \\
\text { order } & \rightarrow & \text { customer item } & \text { item } & \rightarrow \\
\text { id qty }
\end{array}
$$

## XML Document: Tree



## XML Schema

## XML Schema is ...

a simple grammar-based formalism using regular expressions

## Regular expressions are great

- Easy to use
- Robust class of languages: closed under union, intersection, complement, . . .
- Very well understood


## Deterministic Regular Expressions

## UPA constraint

All content models must be deterministic regular expressions.

## Definition

A regular expression $r$ is deterministic if when matching any string from left to right against $r$, we can deterministically match every symbol against a position in $r$, without looking ahead in the string.

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- $(a b)^{*}$ is deterministic.
- (ab)* $a$ is not deterministic


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## Example

- $(a b)^{*}$ is deterministic.
- $(a b)^{*} a$ is not deterministic. Examples: aba and $a$


## Deterministic Regular Expressions

Deterministic regular expressions are ugly

- Easy to use
- Robust class of languages: closed under union, intersection, complement, ...
- Very well Partially understood


## UPA Constraint

## W3C XML Schema Standard

A content model must be formed such that during validation of an element information item sequence, the particle component contained directly, indirectly or implicitly therein with which to attempt to validate each item in the sequence in turn can be uniquely determined without examining the content or attributes of that item, and without any information about the items in the remainder of the sequence.

## XML Schema Validator

## Scenario

- User writes XML Schema Definition containing non-deterministic expression, say $(a+b)^{*} a$, and tries to validate it.
- Validator response: ERROR: non-deterministic content model $(a+b)^{*} a$.


## Smart XML Schema Validator

## Scenario

- User writes XML Schema Definition containing non-deterministic expression, say $(a+b)^{*} a$, and tries to validate it.
- Smart validator response: PROBLEM: non-deterministic content model $(a+b)^{*} a$. However, the content model $b^{*} a\left(b^{*} a\right)^{*}$ describes the same content and is deterministic. Would you like to use it instead?


## Too optimistic ...

## Theorem: Bruggemann-Klein and Wood

Some regular languages are not definable by a deterministic regular expression.

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## Scenario

- User writes XML Schema Definition containing expression (ab)* $a$ and tries to validate it.
- Smart validator response: PROBLEM: non-deterministic content model for ( $a b)^{*}$ a. Moreover, there is no deterministic content model describing exactly this content. However, the content model $a(b ? a)^{*}$ is deterministic and describes the same content plus some additional strings. Would you like to use it instead?


## Goal

## Overall Goal

Develop the tools for a smart schema validator.

## Technical goals

Given a non-deterministic regular expression,

- decide whether its language can be defined by a deterministic expression
- if possible, construct equivalent deterministic expression
- otherwise, construct deterministic overapproximation


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## Remark

All results apply to DTDs

## Deciding Determinism

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Given non-deterministic expression $r$, decide whether there exists a deterministic expression $s$, such that $L(r)=L(s)$.

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## Bruggemann-Klein and Wood 1998

Deciding Determinism can be done in time exponential in the size of $r$.

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Deciding Determinism can be done in time exponential in the size of $r$.

## Theorem

Deciding Determinism is PSPACE-hard.

## Constructing Deterministic Expressions

## Problem

Given a non-deterministic expression $r$, construct a deterministic expression $s$, such that $L(r)=L(s)$.

## Construct Deterministic Expressions: BKW

## Algorithm Bruggemann-Klein and Wood

- Construct minimal DFA.
- Construct deterministic expression by induction on DFA.
- Note: Added a few optimizations.


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## BKW

-     + : If possible always return an equivalent deterministic expression.
-     - : Can create very big expressions (possibly double exponential)


## Example: ( $\left.a^{*} b ? c ? d ? e ? f^{*} g^{*} h^{*} i^{*} j^{*} k^{*} a^{*}\right)$

(. (* (. (a) )) (| (| (. (d) (. (. (. (. (. (. (? (. (| (e) (f)) (* (f) )))))) (? (. (g) (* (. (g) )) )) ) ) (? (. (h) (* (. (h) )))))) (? (. (i) (* (. (i) )))))) (? (. (j) (* (. (j) )))))) (? (. (k) (* (. (k) )) )) )) (? (. (a) (* (. (a) ))) )) )) (| (. (j) (. (. (* (. (j) ))) (? (. (k) (* (k) ) ) ) ) ) (? (. (a) (* (. (a) )) )) )) ) (| (b) (. (. (. (. (. (. (. (. (? (. (c) )) (? (. (d) ))) (? (. (| (e) (f)) (* (. (f) )))))) (? (. (g) (* (. (g) ))))) (? (. (h) (* (. (h) )) )) ) (? (. (i) (* (. (i) )))))) (? (. (j) (* (. (j) )))))) (? (. (k) (* (. (k) ) ) ) ) ) (? (. (a) (* (. (a) )) )) )) ) (| (. (g) (. (. (. (. (. (* (. (g) ))) (? (. (h) (* (. (h) )) ) ) ) (? (. (i) (* (. (i) )))))) (? (. (j) (* (. (j) )))))) (? (. (k) (* (. (k) )))))) (? (. (a) (* (. (a) )) ) ) ) ) (| (. (e) (. (. (. (. (. (. (* (. (f) ))) (? (. (g) (* (. (g)
 (k) (* ( (k) )) ) ) ) (? (. (a) (* (. (a) )) )) )) (| (. (c) (. (. (. (. (. (. (. (? (. (d) )) (? (. (| (e) (f)) (* (. (f) ))) )) (? (. (g) (* (. (g) )) ))) ) (? (. (h) (* (. (h) )))))) (? (. (i) (* (. (i) ))) )) (? (. (j) (* (. (j) )))))) (? (. (k) (* (. (k) )))))) (? (. (a) (* (. (a) )) )) )) (| (. (k) (. (* (. (k) ))) (? (. (a) (* (. (a) ))))))) (| (. (h) (. (. (. (. (* (. (h) ))) (? (. (i) (* (. (i) ))) ))) (? (. (j) (* (. (j) )))))) (? (. (k) (* (. (k) )))))) (? (. (a) (* (. (a) )) )) )) (| (. (f) (. (. (. (. (. (. (* (. (f)) ))) (? (. (g) (*) (g)

## Constructing Deterministic Expressions: GROW

## Goal

Find concise deterministic expressions.

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## Glushkov Automata



KoaToKore (Bex. et. al)

## Constructing Deterministic Expressions: GROW

## Input Expression <br> $a(a+b)^{*} a$

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$a(a+b)^{*} a$
Minimal DFA


KoaToKore: Fail

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## Expansion 1



KoaToKore: Fail

## Constructing Deterministic Expressions: GROW

## Input Expression

$a(a+b)^{*} a$

## Minimal DFA



KoaToKore: Fail

## Expansion 1



KoaToKore: Fail

## Expansion 2



KoaToKore: $a\left(b^{*} a\right)^{*}$

## Constructing Deterministic Expressions: GROW

## Algorithm

- Enumerate all (non-isomorphic) deterministic automata equivalent to $r$, up to a given size.
- Check whether one of these automata is a Glushkov automaton; and construct equivalent expression.


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## GROW

-     + : Returns concise, readable expressions.
-     - : Not always returns an expression


## Approximating Deterministic Expressions

## Problem

Given a non-deterministic expression $r$, construct a deterministic expression $s$, such that $L(r) \subset L(s)$.

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## Optimal Approximations

- An approximation $s$ is optimal if there does not exist a deterministic expression $s^{\prime}$ such that $L(r) \subset L\left(s^{\prime}\right) \subset L(s)$.


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- An approximation $s$ is optimal if there does not exist a deterministic expression $s^{\prime}$ such that $L(r) \subset L\left(s^{\prime}\right) \subset L(s)$.


## Theorem

Let $r$ be an expression such that no equivalent deterministic expression exists. Then, there does not exist an optimal deterministic approximation of $r$.

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## Proof

- Suppose $s$ is optimal approximation of $r$.
- Take $w$ in $L(s)$, not in $L(r)$
- $L(s) \backslash\{w\}$ also definable by deterministic expression $s^{\prime}$, but better approximation than $s$.


## Approximating Deterministic Expressions: Ahonen

## Algorithm by Ahonen: Ahonen-BKW

(1) Given non-deterministic expression $r$, construct its minimal DFA.
(2) "Simulate" BKW algorithm. Stuck $\Rightarrow$ merge states and add transitions.
(3) Construct deterministic expression using BKW algorithm

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## Ahonen-GROW

Alternative: apply GROW instead of BKW in step 3.

## Approximating Deterministic Expressions: Ahonen

## Ahonen-BKW

-     + : Always returns an expression.
-     - : Big expressions.


## Ahonen-GROW

-     + : Small expressions.
-     - : Not always returns an expression


## Approximating Deterministic Expressions: SHRINK

## Goal

Algorithm that always returns small, readable expression.

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## Goal

Algorithm that always returns small, readable expression.
KoaToKore (Bex. et. al)

- When automaton is Glushkov automaton, returns corresponding expression (of equal size)
- Can also return overapproximation (of equal size)


## Approximating Deterministic Expressions: SHRINK

## Input Expression $a^{+}(b a)^{*} b$ ?

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## Minimal DFA



## KoaToKore: Fail

## Approximating Deterministic Expressions: SHRINK

## Input Expression <br> $$
a^{+}(b a)^{*} b ?
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## Minimal DFA



KoaToKore: Fail

## Merged States



KoaToKore: $(a b ?)^{+}$

## Approximating Deterministic Expressions: SHRINK

## Input Expression <br> $$
a^{+}(b a)^{*} b ?
$$

## Minimal DFA



KoaToKore: Fail

## Merged States



KoaToKore: $(a b ?)^{+}$

## Approximating Deterministic Expressions: SHRINK

## Algorithm

- Shrink minimal DFA by merging states (trying to add as little as possible)
- Each DFA: check whether DFA is glushkov, or let koaToKore overapproximate (by adding transitions)


## Experiments: Setup

## Expressions

- Randomly generated.
- 2100 non-deterministic expressions.
- Number of alphabet symbols ranging from 5 to 50.


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## Expressions

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## Repeatability and Workability

We participated in the ACM SIGMOD 2009 Repeatability and Workability Evaluation. The reviewers were able to repeat all the experiments presented in our paper, yielding results that match the ones published in our paper, except from insignificant and to be expected variation due to randomness and-or hardware-software differences. The detailed reports will shortly be made publicly available by ACM SIGMOD.

## Experiments: Deciding Determinism

## Deciding Determinism

- Very efficient (up to 50 milliseconds for largest ones)
- Minimal DFAs are small!


## Experiments: Constructing Deterministic Expressions

## Size of output expressions (and success rate)

| input size | BKW | GROW |
| :--- | :--- | :--- |
| 5 | 7 | $3(89 \%)$ |
| 10 | 95 | $6(66 \%)$ |
| 15 | 394 | $9(43 \%)$ |
| 20 | $/$ | $12(31 \%)$ |
| $25-30$ | $/$ | $13(21 \%)$ |
| $35-50$ | $/$ | $23(7 \%)$ |

## Running times

- GROW and BKW: Less than a second for small expressions.
- GROW: up to 20 seconds for biggest


## Experiments: Approximating Deterministic Expressions

## Measure of Quality

Ratio of number of strings defined by original expression over number by det. approximation: Close to 1 is good

## Quality of Approximations

| input size | Ahonen-BKW | Ahonen-GROW | SHRINK |
| :--- | :--- | :--- | :--- |
| 5 | $0.73(100 \%)$ | $0.71(75 \%)$ | $0.75(100 \%)$ |
| 10 | $0.81(100 \%)$ | $0.79(56 \%)$ | $0.78(100 \%)$ |
| 15 | $0.84(100 \%)$ | $0.88(40 \%)$ | $0.79(100 \%)$ |
| 20 | $/$ | $0.89(18 \%)$ | $0.76(100 \%)$ |
| $25-30$ | $/$ | $0.89(8 \%)$ | $0.71(100 \%)$ |
| $35-50$ | $/$ | $0.75(4 \%)$ | $0.68(100 \%)$ |

## Experiments: Approximating Deterministic Expressions

## Expression sizes (and success rate)

| input size | Ahonen-BKW | Ahonen-GROW | SHRINK |
| :--- | :--- | :--- | :--- |
| 5 | $8(100 \%)$ | $3(75 \%)$ | $3(100 \%)$ |
| 10 | $28(100 \%)$ | $6(56 \%)$ | $6(100 \%)$ |
| 15 | $73(100 \%)$ | $8(40 \%)$ | $8(100 \%)$ |
| 20 | $/$ | $11(18 \%)$ | $10(100 \%)$ |
| $25-30$ | $/$ | $11(8 \%)$ | $13(100 \%)$ |
| $35-50$ | $/$ | $14(4 \%)$ | $18(100 \%)$ |

## SUPAC

## Supportive UPA Checker

Input regular expression
(1) If $r$ is deterministic, return $r$
(2) Else If $L(r)$ is deterministic
(1) If GROW $(r)$ succeeds, return GROW ( $r$ )
(2) Else return best from $\operatorname{BKW}(r)$ and $\operatorname{SHRINK(r)}$
(3) Else return best from Ahonen-GROW $(r)$ and $\operatorname{SHRINK(r)}$

## Future and Current Work

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- Minimization of deterministic expressions
- Experiments using real-world expressions
- Take into account counting operator

