Statistical Analysis of Real XML Data Collections

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Structure of The Talk

- Introduction
- Crawled XML web
- Real XML documents
  - General analyses,
  - Recursion
  - Relational patterns
  - Mixed content
- XML statistics utilization
- Conclusion
Introduction

- XML and related technologies - a leading role among standards for data representation
- Semistructured, self-descriptive
- Possibility to express the allowed structures
  - DTD, XML Schema, Relax NG, ...
- Different techniques are needed for
  - managing, processing, querying, updating
  - compressing, versioning
- ...
- XML analyses can be used for
  - XML pattern processing
  - Repository adaptation
  - Benchmarking
  - ...
General Processing Techniques

- “As general as possible”
  - correct at first glance
  - unnecessarily complex
  - often inefficient
- With restricted features
  - more down-to-earth
  - more effective
  - restrictions are often “unnatural” (based on particular technique)
  - effectiveness suffers when data do not correspond to expectations
Web XML Document Analysis

- L. Mignet, D. Barbosa, P. Veltri: The XML Web: The First Study (ACM 2003)

- Document size varies from 10B to 4.6kB
- For documents up to 4kB the number of element nodes is about 50%, the number of attributes about 30%
  - 18% of elements have no attributes
- Mixed content found in 72% of documents (5% of contents)
- 99% of documents shallow (depth < 8)
  - Average depth 4
- Only 260 total different recursive elements found
- In 98% of recursive documents there is only one recursive element
- 95% of recursive documents do not refer DTD or XSD
Real XML Documents

- Classification
  - data-centric documents (dat)
    - database exports, IMDb, list of employees, ...
  - document-centric documents (doc)
    - Shakespeare's plays, XHTML documents, novels, docbook, ...
  - data exchange documents (ex)
    - medical information, exchange formats, ...
  - reports (rep)
    - overviews or summaries
  - research documents (res)
    - docs with special structures, DNA/RNA, NASA findings, ...
  - semantic web documents (sem)
    - RDF, OWL, DAML, ...
<table>
<thead>
<tr>
<th>Statistics</th>
<th>Results</th>
</tr>
</thead>
<tbody>
<tr>
<td>Number</td>
<td></td>
</tr>
<tr>
<td>Number of XML documents</td>
<td>16,534</td>
</tr>
<tr>
<td>Number of XML collections</td>
<td>133</td>
</tr>
<tr>
<td>Size</td>
<td></td>
</tr>
<tr>
<td>Total size of documents (MB)</td>
<td>20,756</td>
</tr>
<tr>
<td>Minimum size of a document (B)</td>
<td>61</td>
</tr>
<tr>
<td>Maximum size of a document (MB)</td>
<td>1,971</td>
</tr>
<tr>
<td>Average size of a document (MB)</td>
<td>1.3</td>
</tr>
<tr>
<td>Median size of a document (kB)</td>
<td>10</td>
</tr>
<tr>
<td>Schema</td>
<td></td>
</tr>
<tr>
<td>Documents with DTD (%)</td>
<td>74.6</td>
</tr>
<tr>
<td>Documents with XSD (%)</td>
<td>38.2</td>
</tr>
<tr>
<td>Documents without DTD/XSD (%)</td>
<td>7.4</td>
</tr>
</tbody>
</table>

General statistics for XML data
Real XML Documents

Number of Files in Collections

- Document, 40.47%
- Database, 20.64%
- Semantic Web, 4.71%
- Research, 14.82%
- Exchange, 1.32%
- Report, 18.04%
Real XML Documents

Total Sizes of Collections

- Semantic Web, 18.75%
- Database, 10.78%
- Report, 54.78%
- Document, 5.72%
- Research, 8.17%
- Exchange, 1.79%
Real XML Documents

<table>
<thead>
<tr>
<th>Statistics</th>
<th>dat</th>
<th>doc</th>
<th>ex</th>
<th>rep</th>
<th>res</th>
<th>sem</th>
</tr>
</thead>
<tbody>
<tr>
<td>Max. number of elements</td>
<td>402</td>
<td>4,085</td>
<td>37,502</td>
<td>309,379</td>
<td>427</td>
<td>112,942</td>
</tr>
<tr>
<td>Max. number of attributes</td>
<td>9</td>
<td>1,675</td>
<td>5,182</td>
<td>37,815</td>
<td>129</td>
<td>37,996</td>
</tr>
<tr>
<td>Max. number of empty elements</td>
<td>3</td>
<td>361</td>
<td>123</td>
<td>16,348</td>
<td>6</td>
<td>23,635</td>
</tr>
<tr>
<td>Max. number of mixed elements</td>
<td>0</td>
<td>302</td>
<td>21</td>
<td>0</td>
<td>1</td>
<td>0</td>
</tr>
<tr>
<td>Max. number of distinct el. names</td>
<td>81</td>
<td>48</td>
<td>58</td>
<td>388</td>
<td>44</td>
<td>144</td>
</tr>
<tr>
<td>Max. number of rec. elements</td>
<td>0</td>
<td>3</td>
<td>2</td>
<td>0</td>
<td>0</td>
<td>0</td>
</tr>
<tr>
<td>Max. number of distinct paths</td>
<td>79</td>
<td>96</td>
<td>67</td>
<td>312</td>
<td>30</td>
<td>143</td>
</tr>
<tr>
<td>Depth of document</td>
<td>Avg.</td>
<td>5</td>
<td>7</td>
<td>5</td>
<td>5</td>
<td>5</td>
</tr>
<tr>
<td></td>
<td>Max.</td>
<td>5</td>
<td>13</td>
<td>9</td>
<td>6</td>
<td>7</td>
</tr>
</tbody>
</table>

Global statistics for 95% XML documents
## Real XML Documents

<table>
<thead>
<tr>
<th>Statistics</th>
<th>dat</th>
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<th>rep</th>
<th>res</th>
<th>sem</th>
</tr>
</thead>
<tbody>
<tr>
<td>Num. of elements</td>
<td>23,132,565</td>
<td>267,632</td>
<td>2,911,059</td>
<td>1,957,637</td>
<td>21,305,818</td>
<td>25,548,388</td>
</tr>
<tr>
<td>Num. of attributes</td>
<td>33,660,779</td>
<td>102,945</td>
<td>857,691</td>
<td>208,265</td>
<td>2,189,859</td>
<td>10,228,483</td>
</tr>
<tr>
<td>Distinct elem. names</td>
<td>81</td>
<td>134</td>
<td>146</td>
<td>461</td>
<td>210</td>
<td>1,410</td>
</tr>
<tr>
<td>Num. of distinct paths</td>
<td>434</td>
<td>2,086</td>
<td>144</td>
<td>373</td>
<td>426</td>
<td>2,534</td>
</tr>
<tr>
<td>Depth of document</td>
<td>12</td>
<td>459</td>
<td>14</td>
<td>6</td>
<td>19</td>
<td>11</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>Sch.</th>
<th></th>
<th></th>
<th></th>
<th></th>
<th></th>
<th></th>
</tr>
</thead>
<tbody>
<tr>
<td>Distinct elem. names</td>
<td>76</td>
<td>377</td>
<td>523</td>
<td>3,213</td>
<td>250</td>
<td>-</td>
</tr>
<tr>
<td>Num. of distinct paths</td>
<td>115</td>
<td>11,994</td>
<td>1,665</td>
<td>3,137</td>
<td>568</td>
<td>-</td>
</tr>
<tr>
<td>Depth of schema</td>
<td>12</td>
<td>81</td>
<td>79</td>
<td>5</td>
<td>15</td>
<td>-</td>
</tr>
</tbody>
</table>

Maximum values of global statistics
Real XML Documents

Element Frequencies

Attribute Frequencies

Number of Elements

Number of Attributes

Levels

Levels

7
Real XML Documents
Real XML Documents – Fanout Distribution (Database)
Real XML Documents

- New constructs
  - *trivial element* – content model \( a := e \mid pcdata \)
  - *simple element* – consists only of trivial elements
  - *complex elements* – otherwise

- Recursivity
  - *trivial* - “selfrecursive”, no branching
    - \(<a><a><a>...</a></a></a>\)
  - *linear* – similar to trivial but can intermix with regular elements, single recursive element
    - \(<a><b><a>...</a></b><c/></a>\)
  - *pure* – single recursive element, branching possible
    - \(<a><b/><a>...</a><a>...</a><c/><a>...</a><d/></a>\)
  - *general* – more than one recursive element
### Real XML Documents

<table>
<thead>
<tr>
<th>Sch.</th>
<th>Dat</th>
<th>Doc</th>
<th>Ex</th>
<th>Rep</th>
<th>Res</th>
<th>Sem</th>
</tr>
</thead>
<tbody>
<tr>
<td>T</td>
<td>0.06</td>
<td>2.38</td>
<td>3.67</td>
<td>-</td>
<td>0</td>
<td>0.27</td>
</tr>
<tr>
<td>L</td>
<td>0.06</td>
<td>19.92</td>
<td>32.57</td>
<td>-</td>
<td>0.65</td>
<td>2.52</td>
</tr>
<tr>
<td>P</td>
<td>0.03</td>
<td>18.76</td>
<td>22.48</td>
<td>-</td>
<td>0</td>
<td>1.46</td>
</tr>
<tr>
<td>G</td>
<td>0.06</td>
<td>16.20</td>
<td>7.80</td>
<td>-</td>
<td>0.04</td>
<td>0</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>Sch.</th>
<th>Dat</th>
<th>Doc</th>
<th>Ex</th>
<th>Rep</th>
<th>Res</th>
<th>Sem</th>
</tr>
</thead>
<tbody>
<tr>
<td>T</td>
<td>0.2</td>
<td>5.0</td>
<td>6.4</td>
<td>-</td>
<td>0</td>
<td>1.0</td>
</tr>
<tr>
<td>L</td>
<td>0.5</td>
<td>65.3</td>
<td>45.7</td>
<td>-</td>
<td>66.7</td>
<td>92.6</td>
</tr>
<tr>
<td>P</td>
<td>0.7</td>
<td>12.7</td>
<td>26.9</td>
<td>-</td>
<td>0</td>
<td>6.4</td>
</tr>
<tr>
<td>G</td>
<td>98.5</td>
<td>17.0</td>
<td>21.0</td>
<td>-</td>
<td>33.3</td>
<td>0</td>
</tr>
</tbody>
</table>

### Exploitation rate of types of recursions (%)

### Percentage representation of types of recursion (%)
Real XML Documents

- **Shallow Relational Patterns**
  - `<a>`
    - `<b>one</b>`  <!-- trivial elements -->
    - `<b>two</b>`
    - `<b>three</b>`
  - `<a>`

- **Relational Patterns**
  - `<x>`
    - `<a>xxx</a>`  <!-- trivial elements -->
    - `<b>yyy</b>`  <!-- no repetition -->
    - `<c>zzz</c>`
  - `<x>`
  - `<x>`
    - `<a>111</a>`  <!-- trivial elements -->
    - `<c>333</c>`  <!-- missing elements allowed -->
# Real XML Documents

<table>
<thead>
<tr>
<th>Statistics</th>
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<th>rep</th>
<th>res</th>
<th>sem</th>
</tr>
</thead>
<tbody>
<tr>
<td>Elements involved</td>
<td>29.23%</td>
<td>6.23%</td>
<td>29.53%</td>
<td>94.29%</td>
<td>22.66%</td>
<td>41.56%</td>
</tr>
<tr>
<td>Number of occurrences</td>
<td>170,744</td>
<td>154,133</td>
<td>185,358</td>
<td>40,276</td>
<td>619,272</td>
<td>716,038</td>
</tr>
<tr>
<td>Repetition</td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Avg.</td>
<td>10.5</td>
<td>3.3</td>
<td>5.8</td>
<td>322.7</td>
<td>5.1</td>
<td>8.8</td>
</tr>
<tr>
<td>Max.</td>
<td>600,572</td>
<td>1,254</td>
<td>615</td>
<td>102,601</td>
<td>15,814</td>
<td>16,500</td>
</tr>
<tr>
<td>Fan-out</td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Avg.</td>
<td>3.6</td>
<td>1.5</td>
<td>2.2</td>
<td>6.2</td>
<td>2.3</td>
<td>3.5</td>
</tr>
<tr>
<td>Max.</td>
<td>33</td>
<td>10</td>
<td>18</td>
<td>26</td>
<td>51</td>
<td>113</td>
</tr>
</tbody>
</table>

Relational pattern statistics for XML documents per category
Real XML Documents

- **Mixed elements**
  - `<text><par>
    Some semistructured text including special formatting
    <table><tr><td></td>...<tr>...<table>
    and other complex stuff
  </par><par> ... </par> ...
</text>`

- **Simple mixed elements**
  - `<text>Hello <b>bold</b> world!</text>`

<table>
<thead>
<tr>
<th>Statistics</th>
<th>dat</th>
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<th>rep</th>
<th>res</th>
<th>sem</th>
</tr>
</thead>
<tbody>
<tr>
<td>Depth</td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Avg.</td>
<td>1.8</td>
<td>4.1</td>
<td>1.0</td>
<td></td>
<td>1.9</td>
<td>1.2</td>
</tr>
<tr>
<td>Max.</td>
<td>6</td>
<td>448</td>
<td>5</td>
<td></td>
<td>2</td>
<td>3</td>
</tr>
<tr>
<td>Simple mixed contents (%)</td>
<td>55.9</td>
<td>79.4</td>
<td>99.6</td>
<td></td>
<td>1.9</td>
<td>78.4</td>
</tr>
</tbody>
</table>

Mixed-content statistics for XML documents per category
Hybrid XML Repository

- No existing general technique effective for any input data
  - using general method only if necessary
- Identification of data patterns
  - frequent parts to be processed specifically
  - preserving updatability
  - XML Schema exploitation
- Numbering schema integration
XML Fragments

- Features of Patterns
  - Frequent usage in real XML documents
  - Apparent meaning/purpose
  - Existence of effective processing method
  - Apparent typical updates and their possible effective processing
  - Easy recognition

- Fragment categorization
  - known and static (path summary schema)
  - known and finite (path summary schema)
  - mapped to relations (bubble node)
  - mapped to XML-aware text (bubble node)
  - unknown or possibly infinite (ORDPATHs like schema)
Adaptability

- Continuous changes should not affect efficiency adversely
- Invocation
  - fragment insertion
  - document insertion
  - query processing
  - automatically maintained background process

- Open issues:
  - similarity function
  - query adaptation
  - transactions
Real XML Documents - Conclusions

- Amount of tagging dominates size of document
- XML Documents are shallow
  - 95% of documents has < 13 max depth,
  - average is about 5
- Highest amounts of elements, attributes, text nodes and mixed contents are at first levels
  - rapid decrease in higher levels (depths)
- Data are regular
  - data-centric documents can often even described by (fairly simple) relational or shallow relational patterns
  - document-centric XML data also contain significant number of patterns
- Most documents use some kind of standard schema
Real XML Documents - Conclusions

- **Recursion**
  - occurs quite often (doc ~ 43%, ex ~ 64%)
  - the number of recursive elements is low, though
  - it is simple, depth, branching and ed-pair distance is always less than 10
  - the most common type of recursion is linear and pure recursion
  - schemes specify the most general type of recursion

- **Mixed contents**
  - relatively high usage in document/exchange
  - low usage in data-centric documents
  - mostly simple mixed contents
  - depth is on average less than 10