Clone Detection in Source Code by Frequent Itemset Techniques

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Abstract

In this paper we describe a new approach for the detection of clones in source code, which is inspired by the concept of frequent itemsets from data mining.

The source code is represented as an abstract syntax tree in XML. Currently, such XML representations exist for instance for Java, C++, or PROLOG. Our approach is very flexible; it can be configured easily to work with multiple programming languages.

1. Introduction

A frequently observed phenomenon in larger software projects is that certain pieces of code are copied and slightly modified for reuse. A reason for this is the wish of the programmer to take advantage of existing software components. This is not a bad strategy, since components, that are already used, are well tested and known to work. Moreover, in most situations copying the required code fragments is the fastest way to software reuse. Methods for a better encapsulation of the code require a considerable amount of time. In most situations it is hard to produce a working version of the software in time and there is no time left for improving the code.

The handling of duplicated code can be very problematic in many respects. An error in one component is reproduced in every copy. Since it is not documented in which places duplicates can be found, it is extremely hard to find and remove such errors. The maintenance of existing software becomes much more complicated and costly. Moreover, blowing up the code reduces the level of abstraction of the code, which is highly undesirable, since it becomes much harder for others to get acquainted with the code, e.g. for adding new functionality.

It is very likely, that one cannot avoid the occurrence of clones due to the programming with copy and paste. Thus, it is a good strategy to provide tools for the program developer for finding duplicates and for preparing reports about them.

Various attempts have already been made to finding duplicates in software projects. However, most of the known techniques are restricted to analyzing certain programming languages. Tests have shown [4] that none of the existing approaches produces optimal results in all cases.

We have developed a new method based on the concept of frequent itemsets that works on an XML representation of the program [7]. Hence, our method could be extended for searching clones in general tree structures, since we work on a more abstract level.

The rest of the paper is organized as follows: After presenting some basic definitions regarding clones in Section 2, we recapitulate some related work on clone detection in Section 3. In Sections 4 and 5 we introduce our new approach to detecting clones, which is inspired by the concept of frequent itemsets, including the XML representations for the programs and the configuration data. Finally, three case studies are reported in Section 6.

2. Basic Definitions

Code Fragments. A code fragment is a contiguous piece of source code, i.e. one or more successive lines. In our approach one simple statement, which usually corresponds to one line of code, is the smallest unit of measurement.

Different Types of Clones. A clone is a copy of a code fragment. Usually, clones consisting out of more than 5 statements are considered interesting. Since the clone relation is symmetric we better say that the origin and the copy form a clone pair.

To further characterize different types of clones we adopt the notation of [4]: A textual copy where only formatting white space or comments may be changed is called a clone of type 1.

More interesting are clones of type 2, where parameters or variables may have different types or names.



Since we work on an XML representation, we can adapt our definition of clones. In this paper we consider binary expressions as clones, if both operands form an expression clone pair. This recursive definition is anchored in the fact that two different variables or constants are taken as clones, respectively, whereas simple variables are distinguished from array accesses or constants. E.g., the following assignment statements t = a[0] and max = a[2] are clones of type 2. Structured statements such as loops or conditional statements are considered as clones, if the headers (or conditions) as well as the bodies are clones of each other.

Finally, in clones of type 3 one or more statements may be inserted or deleted. Although these are the most common clones, they are very hard to detect. Many of the current clone detection mechanisms including ours cannot (adequately) deal with clones of type 3.

3. Related Work

According to [16] clone detection techniques can be divided into string-based, token-based, or parse tree-based.

Since *string–based* methods like the ones of Baker [1] and Ducasse, Rieger, and Demeyer [6] usually work on the source code directly, they are quite general and may be applied to various languages. On the other hand, the semantics of the underlying programming language is completely ignored. These methods need no internal data structure, but [1] uses p–suffix–trees for optimizing the pattern matching.

The approach of Kamiya, Kusumoto, and Inoue [11] is *token–based*. The sequence of tokens is produced by a scanner and it becomes transformed to a new sequence of tokens by language specific transformation rules and by the replacement of parameters. The last step is the comparison of the possible substrings, and the result is a set of clone pairs.

The parse tree or abstract syntax tree (AST) contains the complete information about the source code. Hence more sophisticated methods for the detection of clones can be applied. Baxter et al. [3] generate an annotated parse tree by a compiler generator and then search for clones. Krinke [12] has chosen program dependency graphs (an extension of ASTs) as the internal format; he uses an iterative approach for detecting maximal similar subgraphs. Additionally, Mayrand, Leblanc, and Merlo [14] use metrics, which are applied to an AST representation to find clones; their unit for measurement are the bodies of functions. A similar technique is described by Rysselberghe [15]. Our approach is also parse tree—based. However, we use an XML representation, and thus we add one level of abstraction.

A comparison of the methods known from literature has shown that so far there exists no single method that is superior to all other methods in all situations [4, 5, 16]. All approaches have certain advantages and disadvantages. Techniques that detect many clones (high recall) also return many code fragments which are no clones (lower precision). In turn, techniques with a high precision will usually have a lower recall.

A major deficiency in all approaches is that too few clones are detected (low recall). Most approaches can find clones of type 1 more easily than clones of type 2. Kamiya, Krinke, Merlo, and Rieger mention that their approaches can also find clones of type 3, but according to a study in [4] in practice only Krinke's approach does. In his approach, however, the clones of the other types are found with a very low recall, and the running time is exponential. Thus, clones of type 3 cannot be larger than a certain size.

4. Finding Clones as Frequent Itemsets

Starting with the XML representation of the AST we generate our initial database, and we employ a link structure and a hash table to speed up the data access. The second step is the application of the algorithm for finding frequent itemsets. Figure 1 shows the overall view of the approach.

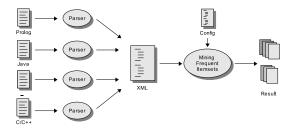


Figure 1. Overall Architecture

4.1. Frequent Itemsets in Data Mining

In data mining [9] frequent itemsets are used to illustrate relationships within large amounts of data. The classical example is the analysis of the buying behavior of customers. The database consists of a set of transactions, and each transaction is a set of items (individual articles) from a universal itemset I^* .

The goal is to find itemsets I that are subsets of many transactions T in the database D ($I \subseteq T$). An itemset is called *frequent*, if it occurs in a percentage that exceeds a certain given support count σ :

$$\sigma(I) = \frac{|\{T \in D \mid I \subseteq T\}|}{|D|} \ge \sigma.$$

An itemset consisting of k items is called k-itemset.



The method for finding frequent itemsets is iterative. First, the set $L_1 = \{ I \subseteq I^* \mid |I| = 1 \land \sigma(I) \ge \sigma \}$ of all frequent 1-itemsets is constructed. The generation of L_k from L_{k-1} is divided into two steps: In the *join step* the set C_k of all the possible candidates for L_k is build by combining itemsets from L_{k-1} that overlap in k-2 items:

$$C'_k = \{ I_1 \cup I_2 \mid I_1, I_2 \in L_{k-1} \land |I_1 \cap I_2| = k-2 \}.$$

 C_k contains all itemsets $I \in C'_k$, such that all k-1-subsets I' of I are in L_{k-1} . This construction is allowed due to the so-called apriori-property, which says that all subsets of frequent itemsets have to be frequent, too. During the prune step the frequent k-itemsets are selected from C_k :

$$L_k = \{ I \in C_k \mid \sigma(I) \ge \sigma \}.$$

This process is repeated until $L_k = \emptyset$, i.e. until no frequent k-itemsets are found. Every itemset $I \in L_k$, such that no extension of I is in L_{k+1} is a maximal frequent itemset.

4.2. Frequent Itemsets for Clone Detection

A program consists of statements, which may be structured; they form the items in the database D. Structured statements contain additional statements. XML configuration files define how to proceed with structured statements; in Section 5 the configuration files will be explained in more detail.

As a refinement of the original algorithm in clone detection a k-itemset can only consist of k consecutive statements. Based on the link structure in the initial database consecutive statements which represent itemsets can be found very fast. Obviously, clones are sequences which occur in at least two places in the program. Thus, clones correspond to frequent itemsets for the support count $\sigma = 2/|D|$.

Given k consecutive statements s_1, \ldots, s_k in our program. The straightforward *join step* would combine two frequent k-1-itemsets of the form

$$I_1 = \{ s_1, \dots, s_{k-1} \}, I_2 = \{ s_2, \dots, s_k \}.$$

For clone detection we found out that it is much more efficient to use a modified join step, which combines a frequent 1-itemset $I_1 = \{s_1\}$ with a frequent k-1-itemset $I_2 = \{s_2, \ldots, s_k\}$. If s_1 is the header of a nested statement, then we allow this join only if I_2 contains the complete body of this nested statement. This is one of the features that are subject to configuration.

As an extension, we can compute clones of type 2 which occur with a given minimal support count $\sigma>2/|D|$ using the same algorithm.

Example. Consider the following code fragment, which determines the maximum max of an array a [0..2] with three values by conditionally exchanging pairs of values:

```
if (a[0] > a[1]) {
 1
 2
         t = a[0];
 3
         a[0] = a[1];
 4
         a[1] = t;
 5
 6
     if (a[1] > a[2]) {
         t = a[1];
 7
         a[1] = a[2];
 8
 9
         a[2] = t;
10
     }
11
     max = a[2];
```

The statements in lines 1, 2, 3, 4, 6, 7, 8, 9, and 11 form frequent 1-itemsets. They form 4 clone classes: $\{1,6\}$, $\{2,7,11\}$, $\{3,8\}$, and $\{4,9\}$. Observe, e.g., that 2 and 3 are no clones of each other, since the variable t is no clone of a [0]. The frequent 2-itemsets are $\{2,3\}$, $\{3,4\}$, $\{7,8\}$, and $\{8,9\}$. The frequent 3-itemsets are $\{2,3,4\}$ and $\{7,8,9\}$. E.g., $I=\{2,3,4\}$ is built by combining the frequent 1-itemset $I_1=\{2\}$ with the frequent 2-itemset $I_2=\{3,4\}$. The frequent 3-itemsets subsume the frequent 1- and 2-itemsets, i.e. the contained 1- and 2-itemsets are removed from the result. Finally, the frequent 4-itemsets are $\{1,2,3,4\}$ and $\{6,7,8,9\}$; they are the result of the algorithm, since they subsume the 3-itemsets.

4.3. Implementational Aspects

We have also investigated to what extent XML query languages such as XQuery can be used in our algorithm for clone detection, since we store Java source code in XML files in JAML format [7]. In one version of our tool the generation of relevant subtrees from the DOM tree is done by using the tool Galax [8] for posing XML queries to JAML files. However, subsequent test cases have shown that this solution is not fast enough. Moreover, it turned out that we did not need to select subelements of an XML document using complex path expressions.

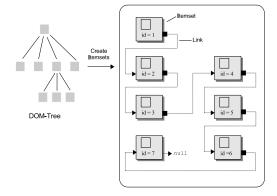


Figure 2. Link Structure



In the current version of our implementation the initial database was used as the basis, and we created an efficient link structure and a hash table for speeding up the data access. This revised version turned out to be relatively efficient for our practical applications. Figure 2 visualizes the link structure in more detail. The identifiers in the picture become the keys for the global hash table.

The worst case *complexity* of our implementation is $O(k \cdot n^2)$ for programs with n statements containing clones of the maximal size k. If the clones are really large, i.e. if k is of the order of n, and if we allow overlapping clones, then this can be at most $O(n^3)$, but in practice k will be a small number.

5. Source Code and Meta Data in XML

The program works on an XML representation of the source code, and it can be configured by an XML file containing meta data about how statements are nested and how they may be considered as clones.

So far we have worked with Java and PROLOG source code. A clever adaption of the configuration files opens the application for other languages and other XML representations of source code.

5.1. Source Code in XML

The Java representation JAML is relatively verbos, since it stores all information – including white spaces and line breaks. E.g., a while-statement

where the attributes of the element symbol and the JAML representation of the condition t < a[i] and the statement i++; have been omitted.

PROLOG rules are represented in another suitable XML language, which was developed in [18]; the DTD is given in the appendix. A PROLOG statement such as

```
forall( member(N, List),
    write(N) )
```

which encodes a loop for printing every element N of a given list List, is represented as

5.2. Meta Data in XML

There exist several XML files for flexibly configuring our algorithm.

The configuration files for Java are based on the Java syntax definition. For instance the following part of the DTD for JAML specifies a while-construct:

```
<!ELEMENT while-statement
  (keyword,
    symbol, condition, symbol,
    %statement;)>
```

The corresponding part in the configuration file java recursion.xml looks like:

The tag recursive_node is used for statements which have a more complex structure and can contain additional statements, such as while, for, if, etc. The body of a while-statement has additional statements.

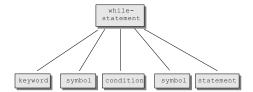


Figure 3. Tree Structure of while-Statement



Figure 3 shows the tree structure of a while-statement in JAML. The node statement is not a real XML node, but it represents a parameter entity (an abbreviation). The element startnode in the configuration file has several attributes: necessary="no" is used to express that there need not exist nested statements (a while-expression does not need a body). If the start node is a parameter entity (such as %statement;), then the lookup-attribute has the value yes; in that case we have to look up the meaning of the possible parameter entities in an additional configuration file java lookup.xml:

Currently, there exist configuration files listing some JAML tags that are not considered during clone detection, i.e., where all attributes and the contents of the corresponding XML elements are ignored. This behavior can be refined by declaring some tags as equivalent or by taking the value of constants into account.

The configuration file _prolog_recursion.xml for PROLOG contains only one element, which specifies how the body of a rule is processed:

```
<recursive_node
  tagname="body">
  <startnode
    necessary="no"
    lookup="no"
    firstNodeBelow="yes"/>
</recursive node>
```

This means that we can detect subsequences of atoms (statements) in rule bodies or complete rules as clones. For clone detection within the rule heads of disjunctive logic programs, which allow for arbitrarily many head atoms, we could add a similar rule which differs from the first one only in the value head for the attribute tagname.

In a more elaborate XML representation we could encode the arguments within the PROLOG atoms for meta predicates such as forall/2 in a slightly different way and specify these meta predicates as additional recursive nodes. Then we could detect clones within PROLOG atoms that represent control structures as well.

6. Case Studies

We have evaluated the Java core API (JDK), another software called HagerROM, which is developed at Würzburg University, our own CloneDetection tool, and a PROLOG toolkit. In this section we report about the case studies with the JDK, the HagerROM, and with PROLOG, respectively. The tool CloneDetection was too small for a useful analysis.

6.1. The Java Development Kit (JDK)

The JDK is an integrated development environment for Java-applications, -applets, and -components, which was developed by Sun Microsystems. The standard version, which can be downloaded free of charge, is accompanied by a huge portion of the sources, which form the Java core API; it consists of several packages, cf. Table 1.

Package	Size	LOC
com	4.6 MB	140 K
java	14.4 MB	421 K
javax	11.5 MB	344 K
org	9.2 MB	278 K

Table 1. Package Sizes

It was remarkable that the package java contributed a large portion of the overall running time, whereas the package javax, which has about the same size, could be handled relatively fast. The reason are the smaller sizes of the sets $|L_k|$ of frequent k-itemsets in the first three iterations, which dominate the run time, cf. Table 2 and Figures 4 and 5.

Table 2 shows the sizes of the clones that we have detected. For javax much fewer frequent 1-itemsets and much fewer clones have been found than for the other packages.

The largest clone which we have detected is a 42-itemset in java; it has the frequency 7. The clone is the body of the method sort1 in java.util.Arrays:

```
private static void
    sort1(TYPE x[], int off, len),
```

where TYPE is one of the 7 primitive types (int, float, etc.). This clone is an example for necessary duplication.

The overall running time for this case study was about 60 minutes. Figure 5 shows that most of the time is spend in the first three iterations, where 29 824, 13 228, and 6 197 maximal clones are found according to Table 2. In the subsequent iterations 4 to 42 only very few further clones are found.



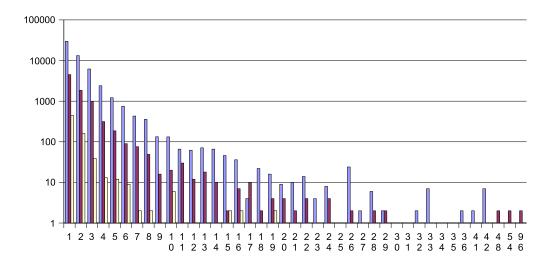


Figure 4. Maximal Clones for the Case Studies JDK, HagerROM, and CloneDetection

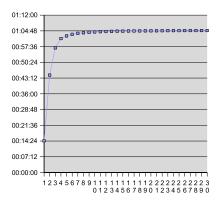


Figure 5. Runtime for the JDK

6.2. The Tool HagerROM

The software HagerROM is a hypertext-based online version of a handbook about drugs and medicine. Its Java part consists of about 87 000 lines of code. It took about 5 minutes to analyze this code.

Many clones were found in code concerning the GUI. A reason could be that the GUI tool from Visual Age for Java, which generates code automatically, had been used in the HagerROM project.

The largest clone of the case study spanned more than 200 lines. It was an older version of a Java class which had been left in the source code although it was not used any more – but the programmer had made a comment mentioning the copying of the code from one class to another.

6.3. The DISLOG Development Kit

We are developing a tool kit called DISLOG Development Kit (DDK), cf. [17], under XPCE/SWI-PROLOG; the functionality ranges from (non-monotonic) reasoning in disjunctive deductive databases to various PROLOG applications, such as a PROLOG software engineering tool and a tool for the management and the visualization of stock information.

Currently, the DDK has about 95 000 lines of PROLOG code, which could be analyzed using our CloneDetection tool in about 90 minutes. Several interesting results about DDK were obtained during the case study.

Clones were searched for in rule bodies. Additionally searching in control structures would not make much of a difference, since explicit control structures occur much less frequently than in procedural languages. Traditionally, in PROLOG most loops have been encoded using linearly recursive predicates, and branching is encoded using different rule alternatives.

The DDK contains about 13000 rules, and the average length of a rule body is about 6 atoms. All of their tag names are atom – even PROLOG meta predicates, such as forall/2 and findall/3, which are used for representing the control structures known from traditional procedural programming languages, are represented as XML elements with the tag name atom. Thus, we have to pairwise compare about 78 000 atoms with a possibly nested structure. These comparisons are relatively expensive, which explains the high running time.



size	com	java	javax	org	sum
1	7 053	13 830	2 101	6 840	29 824
2	2999	6592	716	2921	13 228
3	1 278	2817	340	1762	6 197
4	620	1139	131	501	2391
5	325	606	78	207	1216
6	174	363	81	134	752
7	128	206	33	63	430
8	101	191	25	40	357
9	38	46	21	28	133
10	37	49	16	30	132
11	19	35	2	10	66
12	9	28	4	21	62
13	20	37	2	12	71
14	4	57	2	3	66
15	15	24	2	5	46
16	6	22	2	6	36
17	0	4	0	0	4
18	2	18	0	2	22
19	5	5	0	6	16
20	0	5	0	4	9
21	2	4	0	4	10
22	2	10	0	2	14
23	2	0	0	2	4
24	0	4	0	4	8
:	:	•	:	:	:
42	0	1	0	0	1

Table 2. Maximal Clones for the Different Packages of the JDK

7. Conclusions and Future Work

We have developed a new algorithm for the detection of clones of the types 1 and 2 based on the finding of frequent itemsets. The evaluation has demonstrated the feasibility of our approach.

The program works on an XML representation of the source code, and it can be configured by XML files containing meta data about how statements are nested and how they may be considered as clones. Thus, alternative definitions of type 2 clones can easily be obtained. A clever adaption of these configuration files opens the application for *other languages* and other XML representations of the source code. For representing Java source code we currently use the XML language JAML [7], but an alternative source language independent format such as srcML [13] would also be possible.

We see two major applications of clone detection. Firstly, it signals weak points in the program and encour-

ages the *restructuring* and *refactoring*. A fully automatic replacement of clones by higher order structures, however, is certainly not the best choice. But in this aspect an integration with an interactive program development environment would be very helpful. A second application is the detection of copies (clones) in a *teaching environment*. We will pursue these two applications in the future

Furthermore, we will extend the algorithm to detect clones of type 3 and clones that occur with a frequency greater than 2 as well. The latter will be possible in our approach, since we can simply lift the support count for frequent itemsets.

The definition of clones itself will be made more flexible and adaptable by providing more configuration files with meta data.

Finally, note that a preprocessing step of the XML representation of the abstract syntax tree using XSLT transformations can enable our algorithm to work on general XML files. It is remarkable that this extension will actually mean a simplification of the algorithm.

References

- Brenda S. Baker: On Finding Duplication and Near– Duplication in Large Software Systems, Proc. Second Working Conference on Reverse Engineering, WCRE 1995.
- [2] Magdalena Balazinska, Ettore M. Merlo, Michel Dagenais, Bruno Laguë, Kostas Kontogiannis: Measuring Clone Based Reengineering Opportunities, Proc. 6th International Symposium on Software Metrics, METRICS 1999.
- [3] Ira D. Baxter, Andrew Yahin, Leonardo Moura, Marcelo Sant'Anna, Lorraine Bier: Clone Detection Using Abstract Syntax Trees, Proc. International Conference on Software Maintenance, ICSM 1998.
- [4] Stefan Bellon, Daniel Simon: Vergleich von Klonerkennungstechniken (Comparison of Clone Detection Techniques), Proc. 5th Workshop on Software Reengineering, WSR 2003.
- [5] Elizabeth Burd, John Bailey: Evaluating Clone Detection Tools for Use during Preventative Maintenance, Proc. 2nd International Workshop on Source Code Analysis and Manipulation, SCAM 2002.
- [6] Stéphane Ducasse, Matthias Rieger, Serge Demeyer: A Language Independent Approach for Detecting Duplicated Code, Proc. International Conference on Software Maintenance, ICSM 1999.



- [7] Gregor Fischer, Jürgen Wolff v. Gudenberg: Simplifying Source Code Analysis by an XML Representation, Softwaretechnik Trends, vol. 23(2), 2003.
- [8] Galax A Software for XQuery: http://db.bell-labs.com/galax/
- [9] Jiawei Han, Micheline Kamber: Data Mining Concepts and Techniques, Morgan Kaufmann, 2001.
- [10] Marbod Hopfner, Dietmar Seipel, Jürgen Wolff v. Gudenberg: Comprehending and Visualising Source Code based on XML–Representations and Call Graphs, Proc. 11th International Workshop on Program Comprehension, IWPC 2003.
- [11] Toshihiro Kamiya, Shinji Kusumoto, Katsuro Inoue: CCFinder: A Multi–Linguistic Token–Based Code Clone Detection System for Large Scale Source Code, IEEE Transactions on Software Engineering, vol. 28(7), 2002.
- [12] Jens Krinke: Identifying Similar Code with Program Dependence Graphs, Proc. 8th Working Conference on Reverse Engineering, WCRE 2001.
- [13] Jonathan I. Maletic, Michael L. Collard, Andrian Marcus: Source Code Files as Structured Documents, Proc. 10th International Workshop on Program Comprehension, IWPC 2002.
- [14] Jean Mayrand, Claude Leblanc, Ettore M. Merlo: Experiment on the Automatic Detection of Function Clones in a Software System Using Metrics, Proc. International Conference on Software Maintenance, ICSM 1996.
- [15] Filip van Rysselberghe: Detecting Duplicated Code Using Metric Fingerprints. Master's thesis, University of Antwerp, 2002.
- [16] Filip van Rysselberghe, Serge Demeyer: Evaluating Clone Detection Techniques, Proc. International Workshop on Evolution of Large Scale Industrial Applications, ELISA 2003.
- [17] Dietmar Seipel: DISLOG A Disjunctive Deductive Database Prototype, Proc. 12th Workshop on Logic Programming, WLP 1997.
- [18] Dietmar Seipel, Marbod Hopfner, Bernd Heumesser: Analyzing and Visualizing PROLOG Programs based on XML–Representations, Proc. Workshop on Logic Programming Environments, WLPE 2003.

Appendix

The following XML representation for PROLOG rules was developed in [18]. E.g., the transitive closure rule

```
tc(U1, U2) :-
    arc(U1, U3),
    tc(U3, U2).
is represented as
  <rule file="transitive closure">
    <head>
      <atom predicate="tc/2">
        <var name="U1"/>
        <var name="U2"/>
      </atom>
    </head>
    <body>
      <atom predicate="arc/2">
        <var name="U1"/>
        <var name="U3"/>
      </atom>
      <atom predicate="tc/2">
        <var name="U3"/>
        <var name="U2"/>
      </atom>
    </body>
   </rule>
  We have used the following DTD:
  <!ELEMENT program (rule*)>
  <!ELEMENT rule (head, body) >
```

```
<!ELEMENT program (rule*)>
<!ELEMENT rule (head, body)>
<!ELEMENT head (atom*)>
<!ELEMENT body (atom*)>
<!ELEMENT atom ((term|var)*)>
<!ELEMENT term (term*)>

<!ATTLIST rule
    file CDATA #required>
<!ATTLIST atom
    predicate CDATA #required>
<!ATTLIST term
    functor CDATA #implied>
<!ATTLIST var
    name CDATA #implied>
```

