XCRF User Manual Version 1.0

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1 About XCRF

XCRF is a framework for building conditional models for labeling XML documents. XCRF is a Java implementation of Conditional Random Fields (CRF [LMP01]) for trees.

XCRFs are very flexible and can also label sequences. Using XCRFs usually assumes

- a training phase that consists in building the model using a sample of annotated data; and
- an inference phase that consists in using the model to annotate data.

CRF definition relies on a set of feature functions. In this XCRF implementation features can be easily designed by end users. We also provide perl scripts that automatically generate features from a given sample of XML trees.

An example of application of XCRF is the RSS feed generator available at http://r2s2.futurs.inria.fr.

This implementation follows the paper [JGTT06]. XCRF is developed by Hanh-Missi Tran as part of the MOSTRARE INRIA project¹. XCRF is open source and released under the Gnu Public Licence. Last version of XCRF can be downloaded from http://treecrf.gforge.inria.fr.

2 Getting Started

2.1 Requirements

XCRF is developed in Java 1.6 on Amd64 architecture on Linux machines. Java 6.0 last release can be downloaded from http://java.sun.com/javase/downloads/index.jsp. XCRF is known to work with Java JRE 1.5 or higher.

The XCRF system may need a lot of memory. Use the -Xms and -Xmx options of the Java interpreter to respectively set the initial heap size and the maximum heap size. In the examples provided in the XCRF release, both values are set to 1GB.

2.2 Installation

Download the last version from http://treecrf.gforge.inria.fr. XCRF is tarred and compressed using GNU tar.

```
$> tar xzf xcrf-<release>.tar.gz
```

2.3 Building

You can fetch sources from the INRIA gforge platform. Use Apache Ant to build the XCRF project.

```
$>tar xzf xcrf-src-<release>.tar.gz
$>cd xcrf-src-<release>
$>ant clean
$>ant jar
```

http://mostrare.futurs.inria.fr

2.4 First Annotation

There are two examples in the release that may help you to learn how to use XCRF. You can check your installation with the provided shell scripts:

```
$> cd xcrf-<release>
$> ./exampleLearnTree.sh
$> ./exampleAnnotateTrees.sh
```

The first script trains a given XCRF on a given dataset. The script calls the main XCRF executable with 4 arguments: the way the XML files are read (annotation reader), the location of the given XCRF, the location of the corpus, the location where to store the trained XCRF. Ouputs of this command recall these parameters and log some informations:

```
Apply on:
        .Annotation reader specified by the file at xcrf/examples/tree/annotationReader.xml
        .CRF specified by the file at xcrf/examples/tree/crfLO_0.xml
        .Corpus specified by the directory at xcrf/examples/tree/L0-0
        .Result stored in the file at xcrf/examples/tree/crfResult.xml
xcrf/examples/tree/LO-0/right.png was not taken into account. See log file for further information.
xcrf/examples/tree/LO-0/plus.png was not taken into account. See log file for further information.
xcrf/examples/tree/LO-0/soccer.css was not taken into account. See log file for further information.
xcrf/examples/tree/L0-0/valid-xhtml10.png was not taken into account. See log file for further
xcrf/examples/tree/L0-0/vcss.png was not taken into account. See log file for further information.
xcrf/examples/tree/LO-0/left.png was not taken into account. See log file for further information.
Features number: 169
Step 0 : log-likelihood = -1042.9554566639504
Step 1 : log-likelihood = -1010.065095643635
Step 2 : log-likelihood = -889.5786477936114
Step 3 : log-likelihood = -714.3432154612206
Step 4 : log-likelihood = -714.3076709756092
Step 5 : log-likelihood = -714.181690449722
Step 6 : log-likelihood = -713.8406801412021
Step 7 : log-likelihood = -713.72957530278
Step 8 : log-likelihood = -713.6635863166109
Step 9 : log-likelihood = -713.6326852066597
Step 10 : log-likelihood = -713.6168350671788
Step 11 : log-likelihood = -713.6089847731439
Step 12 : log-likelihood = -713.6050431327774
Step 13 : log-likelihood = -713.6030743016719
Step 14 : log-likelihood = -713.6020888749797
Step 15 : log-likelihood = -713.6015960522686
Step 16 : log-likelihood = -713.6013495280447
Step 17 : log-likelihood = -713.6012262423114
Step 18 : log-likelihood = -713.6011646042857
Step 19 : log-likelihood = -713.6011338084849
Step 20 : log-likelihood = -713.601118442908
Step 21 : log-likelihood = -713.601110798083
Step 22 : log-likelihood = -713.6011070168237
Step 23 : log-likelihood = -713.6011051697308
Learning time: 0.45705 min
```

Messages indicate that some parts of the data (images files in png format, and stylesheets which are not XML files) are not considered. Training is based on a gradient based method which maximizes likelihood of the data set. Intermediate results are also reported on the standard output.

The second scripts (./exampleAnnotateTrees.sh) annotates a label free data set with predicted labels. The script take 4 arguments: the way the predicted labels are written into the XML files (annotation writer), the location of the XCRF (in this case, the XCRF obtained previously), the location XML file to annotate. The result is stored in the location given by the fourth argument.

```
Apply on:

.Annotation writer specified by the file at xcrf/examples/tree/annotationWriter.xml
.CRF specified by the file at xcrf/examples/tree/crfResult.xml
.File to annotate specified by the directory at xcrf/examples/tree/testDelta1.xml
.Result stored in the file at xcrf/examples/tree/annotated.xml
```

3 XCRF definition

Basically, an XCRF annotates with labels element nodes (internal nodes), text nodes (leaves) such as PCDATA or attribute nodes of XML data. An XCRF essentially annotates trees but can also be used on sequences. This section only describes XCRF for trees. In the following, an XML file without any annotation will be called an *observation*.

The way XML files are annotated is very flexible. It can be parameterized by annotation processors. You can write your own annotation processor or use the default one. We assume in this section that the default annotation processor is used. Section 5 covers the details about annotation processors.

An XCRF is represented by an XML file whose schema is available in xml/crf.xsd. An XCRF as a root element Crf and four kinds of first level nodes.

Labels (element-required) a set of annotation labels;

SetsOfLabels (element-optional) subsets of labels, which can be useful for feature functions and constraints definition;

Constraints (element-optional) a list of constraints;

Features (element-required) a set of feature functions.

The list of constraints and the list of subsets of labels are not required. The set of labels and the set of features cannot be non empty: at least one of each is required.

The root element Crf has an attribute type which is either

- tree for XML trees labeling, that is node labelling;
- sequence for sequence labeling;
- mixt for labeling nodes and sequences in text nodes of XML trees.

A skeleton of an XCRF definition is:

```
<Crf xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance"
    xsi:noNamespaceSchemaLocation="crf.xsd"
    type="tree">
    <Labels>
```

3.1 Labels

An annotation label is described by an identifier and by its value. Identifiers are used in the definition of subsets of labels and the definition of features. The identifier must be of the form label_someword where someword is written with alphanumeric symbols and $_ \setminus$ or $-^2$. Note that there cannot be two annotation labels with the same value.

It may happen that you don't want to annotate each node of a tree (for example, you want to annotate the text leaves only). This absence of label is specified using the attribute emptyAnnotation of the element Labels.

Figure 1 shows how you can describe a set of labels. This set holds four annotation labels: NOANN, club, date and league. In the element Labels, we associate the label NOANN with the "empty annotation label".

Figure 1: Example of a set of labels specification

```
<Labels emptyAnnotation="label_NOANN">
  <Label value="NOANN" name="label_NOANN"/>
  <Label value="club" name="label_club"/>
  <Label value="league" name="label_league"/>
  <Label value="date" name="label_date"/>
  </Labels>
```

²The identifier must match the regular expression $label_[a-zA-Z0-9_\]+$ and the value must match the regular expression $[a-zA-Z0-9_\]+$.

3.2 Subsets of labels

A subset of labels is composed of a list of one or more labels. It can be referred to by an identifier³. Figure 2 provides an example of a subset of labels definition that contains only one element. Its identifier is set_SomeSet and it contains two labels: club and league. Identifiers of labels are written in the attribute labels of the element SetOfLabels.

Figure 2: Example of a set of label subsets

```
<SetsOfLabels>
  <SetOfLabels labels="label_club label_league" name="set_SomeSet"/>
  </SetsOfLabels>
```

3.3 Features

A feature is a \mathbb{R} -valued function. All features are evaluated on all nodes and their results are weighted. (Therefore, we usually use 0-1-valued features.)

3.3.1 Features for XML Data

Basically, given a current node, features evaluate some tests on the observation and on the annotation to compute their outcomes. Tests on the observation are unrestricted. Tests on the annotation are limited to a neighborhood of the current node. In the XCRF implementation, we consider four types of features:

- 1. features that can make test on the annotation of the current node;
- 2. features that can make test on the annotation of the current node and its parent;
- 3. features that can make test on the annotation of the current node and its next-sibling;
- 4. features that can make test on the annotation of the current node, its parent and its next-sibling.

For a given set of one, two, or three nodes, a feature function evaluates to 1 (or more generally to some custom value) if the observation tests are true and the node labels meet the feature definition and evaluates to 0 otherwise.

The set of features is defined by an element named Features, and each feature is defined by an element Feature with:

³The identifier must match the regular expression set_[a-zA-Z0-9_\-]+.

FeatureValue (element-optional) By default a feature is a 1-0-valued function, but the feature may be a x-0 function where x is the result of the computation of the expression contained in this element.

Ycur, Ypar, Ysib Elements that store the label of the current node, its parent, its next-sibling.

- Element Ycur is required,
- Element Ypar is required only for features of type: Current-Parent, Current-Parent-Sibling;
- Element Ysib is required only for features of type:
 Current-Parent-Sibling, Current-Parent-Sibling;

Elements Ycur, Ypar, Ysib have a required attribute xsi:type whose value can be Label or SetOfLabels.

testX (element-optional) a set (which can be empty) of tests on observations. An observation test is specified as an XPATH expression which is evaluated in the context of the current node.

3.3.2 Examples

Figure 3 describes a feature that checks if the annotation of the current node is the label club. Note the type of the feature and the type of the annotation test.

The feature will be applied to any node and will be 1 valued for a given node if it is labeled by club and 0 otherwise.

```
<Feature xsi:type="CurrentNode" name="Simple feature">
  <Ycur xsi:type="Label" value="label_club"/>
  </Feature>
```

Figure 3: A simple feature without any test on the observation.

Figure 3 describes a feature that checks if the annotation of the current node is the label club and its sibling has an annotation in the set set_SomeSet.

```
<Feature xsi:type="Current-Sibling" name="Simple feature2">
   <Ycur xsi:type="Label" value="label_club"/>
   <Ysib xsi:type="SetOfLabels" value="set_SomeSet"/>
   </Feature>
```

Figure 4: A feature, without any test on the observation, that uses a set of labels.

Figure 5 adds two observation tests to the feature of the figure 3. Tests on the observation are XPATH expressions. The first one says that the current node has a parent td and a grand-parent tr. The second one says that the parent of the current node is the first td node.

Figure 6 depicts a complete example of feature. Its name is f_client and its weight is equal to 7.46. The annotation tests describe that:

```
<Feature xsi:type="CurrentNode" name="Simple feature">
  <Ycur xsi:type="Label" value="label_club"/>
  <TestX value="./parent::*[name()='td']/parent::*[name()='tr']"/>
  <TestX value="count(./parent::*[name()='td']/preceding-sibling::*[name()='td'])=0"/>
  </Feature>
```

Figure 5: A feature with tests on the observation.

- the annotation label of the current node is the same as the label identified by label_club;
- the annotation label of the parent node is equal to the label identified by label_name;
- the annotation label of the sibling node is equal to the label identified by label_city.

```
<Feature name="f_client" weight="7.46" xsi:type="Current-Parent-Sibling">
  <Ycur xsi:type="Label" value="label_club"/>
  <Ypar xsi:type="Label" value="label_name"/>
  <Ysib xsi:type="Label" value="label_city"/>
  <TestX value="name() = 'tr'"/>
  <TestX value="ancestor::*/@id"/>
  <TestX value="name(following-sibling::*[1]) = 'td'"/>
  </Feature>
```

Figure 6: A complete example of feature on trees.

3.3.3 Features for Sequences

Given a current position in the sequence, features evaluate some tests on the observation and on the annotation to compute their outcomes. There exists two kinds of features for sequences:

- 1. Features that consider only the annotation on the current token (CurrentToken).
- 2. Features that consider the annotation on the current token and the annotation on the preceding one Token-PrevToken.

In both cases, the test on the observable is specified by exactly two tests (TestX). The first one is a regular expression applied to the sequence up to the current token. The second one is a regular expression applied to the sequence from the current token to the end of the sequence. Admitted regular expressions are described in the java api documentation.

Element Ycur (resp. Yprev) store the label of the current node (resp. its predecessor).

3.3.4 Example

In the following example, the feature f_club is evaluated to 1 if and only if the current token is labeled by the value of the label_club and the observed string before the current token matches Club: {1,3}\$ and the observed string after the current token matches results.

So the observed string before the current token must end with Club: followed by 1, 2 or 3 spaces and the observed string after the token must contain the substring results.

```
<Feature name="f_club" xsi:type="CurrentToken">
  <Ycur xsi:type="Label" value="label_club"/>
  <TestX value="Club: {1,3}$"/>
  <TestX value="results"/>
  </Feature>
```

3.4 Constraints

Constraints work currently with CRF for trees only.

Constraints are used to restrict the possible label assignments. Types of constraints are similar to types of features. Only local tests can be done on the labeling through constraints. Accepted constraints are CurrentNode-Constraint, Current-Parent-Constraint, Current-Sibling-Constraint and Current-Parent-Sibling-Constraint. All contraints are evaluated at each node, denoted by the current node. The Current-Sibling-Constraint is not implemented. You can use the Current-Parent-Sibling-Constraint constraint to get the equivalent effects.

For example, we want to forbid all annotations where a node and its parents are both labeled by club. In the XML specification shown in the figure 7, we describe that the constraint is associated with every couple of nodes formed by a node and its parent (hence the use of the Current-Parent-Constraint type). Then we specify the couple of annotations we forbid for all these node couples. The element Ycur refers to the current label of the forbidden annotation pair and the element Ypar refers to the parent label of the forbidden annotation pair.

```
<Constraint xsi:type="Current-Parent-Constraint">
  <Ycur xsi:type="AnnotationLabel" value="label_club"/>
  <Ypar xsi:type="AnnotationLabel" value="label_club"/>
  </Constraint>
```

Figure 7: A constraint example: any couple of the form a node and its parent cannot be labeled by (club, club).

The use of sets of labels provides shortcuts to define more complex constraints. For instance, if you want to forbid the annotation pair (a,b) where a is either the label club or the label league and where b is the label club, there are two solutions. The first one consists in writing a constraint that forbids (club,club) and another constraint that forbids (league,club). The second solution allows the user to write only one constraint in this case. It relies on the use of labels subset. Instead of referring to a single label, the element of an annotation pair may refer to a subset of labels as shown in the figure 8.

```
<Constraint xsi:type="Current-Parent-Constraint">
  <Ycur xsi:type="AnnotationSeqLabel" value="set_SomeSet"/>
  <Ypar xsi:type="AnnotationLabel" value="label_club"/>
  </Constraint>
```

Figure 8: A more complex constraint example. Here setSomeSet is the set of labels containing the values club and league.

It is possible to add predicates on the observation to build constraints that behave differently depending on the position of the current node and the observed data. In an XCRF, the predicate is an XPATH expression whose context node is the current node.

For example, if we want to forbid the annotation pair shown in the figure 7 only for node couples where the parent node is an element p and the child node is an element strong, we add a predicate under the element ConstraintPredicate with the XPATH test . [name() = 'strong']/parent::p.

```
<Constraint xsi:type="Current-Parent-Constraint">
  <ConstraintPredicate value=".[name() = 'strong']/parent::p"/>
  <Ycur xsi:type="AnnotationLabel" value="label_club"/>
  <Ypar xsi:type="AnnotationLabel" value="label_club"/>
  </Constraint>
```

Figure 9: Local constraint example

4 XCRF operations

Shell scripts are provided to help you start with XCRF operations.

4.1 Training

Training an XCRF is launched by calling the xcrf.LearnTree class. Examine the script learnTree.sh as a first example.

Basically, training requires to give an XCRF and a corpus as an argument and produces a new XCRF. The command synopsis is:

```
$>java -jar xcrf.jar train [options] crf_in corpus crf_out
```

- train is the command
- crf_in and crf_out are XML files that describe XCRF. See Section 3 for the format of this file.
- corpus is the path to the training corpus. The XCRF system takes only into account well-formed and well-annotated documents.

4.1.1 Options

- -v: print log-likelihood during the training phase.
- -c file.xml : specify an annotation reader in file.xml
- -d attributeNameForInternalNodes attributeNameForTextLeaves

attributeNameForAttributes: use the default annotation reader by specifying the attribute names used to hold the annotation label respectively for internal nodes, for text leaves and for attributes.

The last two options are mutually exclusive and described in section 5.

4.1.2 Example

The operation explained here uses the example in examples/tree/LO-0. The goal of this operation is to learn to annotate pages about soccer (provided by the corpus of the example). The set of labels that are used to annotate pages is described in the XCRF file (crfLO_0.xml). In this file, we have written only features specific to the example but you can of course specify as many features as you want.

The script exampleLearnTree.sh of the XCRF release shows how to perform a corpus training:

```
./learnTree.sh -v -c examples/tree/L0-0/annotationReader.xml\
    examples/tree/L0-0/crfL0_0.xml examples/tree/L0-0/trainingCorpus\
    examples/tree/L0-0/crfResult.xml
```

In this example, the variation of the log-likelihood is printed (option -v). We use a custom-built annotation reader using (option -c) located at examples/tree/LO-0/annotationReader.xml. At last three paths are given:

- the path to the CRF (examples/tree/LO-0/crfLO_0.xml);
- the path to the training corpus (examples/tree/LO-0/trainingCorpus);
- the path to the training result (examples/tree/LO-0/crfResult.xml).

4.2 Corpus Annotation

The corpus annotation is performed by calling the xcrf.AnnotateTrees class. Examine the script annotateTrees.sh as a first example.

Basically, corpus annotation requires to give an XCRF and a corpus as an argument and produces a new corpus. The command synopsis is:

```
$>java -jar xcrf.jar annotation [options] crf corpus_in corpus_out
```

- annotate is the command
- crf is the XML file that describe XCRF. See Section 3 for the format of this file.
- corpus_in and corpus_out are the paths to corpus.

4.2.1 Options

- -cMargProb file.xml : specify a marginal probabilities setter in file.xml
- -dMargProb attributeNameForInternalNodes attributeNameForTextLeaves attributeNameForAttributes: use the default marginal probabilities setter by specifying the attribute names used to hold the marginal probabilities respectively for internal nodes, for text leaves and for attributes.
- -cAnnWriter file.xml : specify an annotation writer in file.xml
- -dAnnWriter attributeNameForInternalNodes attributeNameForTextLeaves attributeNameForAttributes: use the default annotation writer by specifying the attribute names used to hold the annotation label respectively for internal nodes, for text leaves and for attributes.

The first two options are mutually exclusive. The last two options are mutually exclusive.

4.2.2 Example

At the end of the training step, the weights of the features were computed according to the provided annotated corpus. We want now to use the updated XCRF to annotate a raw corpus.

The script exampleAnnotateTrees.sh of the XCRF release shows how to perform a corpus training:

We use a custom-built annotation writer using -cAnnWriter option. The writer is located at examples/tree/LO-0/annotationWriter.xml. Then three paths are given in this example:

- examples/tree/LO-0/crfResult.xml: the path to the XCRF;
- examples/tree/LO-0/rawCorpus: the path to the corpus to be annotated;
- examples/tree/L0-0/annotatedCorpus: the path to the directory where to save the annotated documents.

5 Annotation Processor Format

An annotation processor is a tool that reads or writes annotation labels. Readers are called in the training phase and writers are called in the labeling phase. Readers and Writers can be customized to fulfill your requirements. A default annotation processor is given and can be slightly configured on the command line.

5.1 Default Annotation Processor

The default annotation processor writes and reads labels at the node level into new attribute nodes. Names of these new attributes depend on the type of node that is labeled:

- slot is the attribute name for the label of an **element** node;
- slot_attr is the attribute name for the label of an attribute node named attr;
- slotL is the attribute name for the sequence of labels of text nodes. Such attributes are located in the parent of text nodes. For instance, when an element node has two text nodes, it has an attribute slotL="label1 label2" which means that the first text node is labeled with label1 and the second text node is labeled with label2.

Let us consider the following example:

```
<div slot="lab1">
  a piece of
  <a href="other.html" slot_href="lab2">text</a>
  in a node.

</div>
```

In this example,

- element node div is labeled by lab1
- element node p is labeled by lab5
- attribute node href of node a is labeled by lab2
- text nodes 'a piece of' and 'in a node' of node p are respectively labeled by lab3 and lab4.

The names of the attributes used to hold the annotation labels can be chosen on the command line when the training or the labeling is launched (the -d option see 4.1.1).

For elements, attribute nodes and text nodes, the empty annotation label (see section 3.1 for more details) is assigned if no label is specified.

5.2 Advanced Annotation Processors

This section is dedicated to the design of specific annotation writers and readers. Let us start with a simple example.

5.2.1 Simple Example

Suppose we are faced an annotation tasks that concerns only elements nodes of some XML files. Therefore, we want to get rid off any prediction about attributes and text nodes. This will speed up the learning and inference tasks because the number of labels to predict will be reduced. To do that, we define an annotation processor that reads annotation labels only for internal nodes. The annotation processor can be designed by a simple declaration of some java class together with its parameters. This declaration follows an XML syntax:

```
<AnnotationProcessor
  class="mostrare.tree.annotation.AttributeForInternalNodeAnnotationReader">
  <Argument>slotE</Argument>
  </AnnotationProcessor>
```

We use the annotation reader that fits our needs by referring to the Java class:

mostrare.tree.annotation.AttributeForInternalNodeAnnotationReader

Details about this reader can be obtained from the XCRF Java doc. The unique constructor is:

```
AttributeForInternalNodeAnnotationReader(String attributeName, CRF crf)
```

Each constructor of an annotation processor should have a XCRF as its last argument. That is why it is omitted in the XML specification. The only parameter to provide is the argument attributeName. In the example, we have set its value to slotE in the element Argument.

5.2.2 More Complex Example

How to specify an annotation processor that reads the annotation labels of internal nodes and text leaves? The first solution lies in creating an implementation that perform both readings. A smarter solution consists in gathering an annotation reader for internal nodes and an annotation reader for text leaves as described in the figure 10.

The XCRF API provides an annotation reader for internal nodes and an annotation reader for text leaves by means of two classes:

- mostrare.tree.annotation.AttributesForTextLeavesAnnotationReader
- $\bullet \ \texttt{mostrare.tree.annotation.Attributes} \\ For Internal Node \texttt{AnnotationReader}$

We put them together by using the annotation reader implemented by the class: mostrare.tree.annotation.AnnotationReaderLooseWrapper

This class acts as a list node. It wraps an annotation reader and points to another annotation reader. When it is called to read annotation labels, it will first use the annotation reader it wraps and then the other annotation reader. In our example, the annotation reader first reads annotation labels for internal nodes and then reads annotation labels for text leaves.

5.3 XML Description

The XML specification of an annotation processor is based on the Java implementation. You have to refer to the constructors of the Java class that implement the annotation processor you want to use. As illustrated in previous examples, arguments of an annotation processor constructor are either annotation processors or strings.

So in XML an annotation processor is specified by an element named AnnotationProcessor and its Java implementation is put in the attribute named class. The children of the annotation processor element are either annotation processor elements or elements named Argument that contain text values.

Figure 10: Annotation reader for internal nodes and text leaves

5.4 Changing Default Annotation Processor

You can find the default annotation reader at xml/annotationReaderDefault.xml in the release. This annotation reader gets the annotations of the attributes, the text leaves and the internal nodes of a tree. It also names the attributes (slot, slot_attr, slotL) to handle labels.

When you invoke the XCRF jar with the -c option (see 4.1.1), this XML file is no more considered. Corresponding Readers and Writers are directly synthetized and parametrized with the corresponding classes. This is also the case with the -d option.

6 Configuration

An XML file config.xml in the main directory handles the configuration of the XCRF program. Currently ten properties can be specified:

- crfXSD: the path to the XCRF XML-Schema;
- annotationProcessorXSD: the path to the annotation processor XML-Schema;
- search: the implementation of the algorithm that maximizes the log-likelihood;
- iterMax: the maximum number of iterations for the previously selected algorithm;
- XPath: the XPATH implementation;
- penalty: the penalty applied to the log-likelihood;
- attributeAsNode: the addition of the attributes in the tree model or not;
- inputEncoding: the encoding of the input documents;
- globalConstraintIterator: the kind of iterator over annotations used for an XCRF with constraints.
- prefixPreprocAttr: the start of the name of the attributes that shouldn't be taken into account in the XCRF training and in the annotation.

6.1 Algorithms to Maximize the log-likelihood

The algorithm used in XCRF API is a Quasi-Newton algorithm (LBFGS[LN89]). Two implementations are available:

- a translation from Fortran to Java⁴;
- a modified version of the Mallet implementation⁵.

The value of search property is either Riso or Mallet.

6.2 XPATH Version

You can use two XPATH implementations:

- Jaxen ⁶: it is the XPATH implementation on which the Dom4 j API ⁷ lies. It provides XPATH1.0;
- Saxon 8: this API allows to use XPATH2.0.

The value of the XPATH property is either Jaxen or Saxon.

6.3 Penalty Applied to the log-likelihood

In order to avoid overfitting when learning a new XCRF, the criterion for parameter estimation is the penalized log-likelihood. For more information, see [Gup].

7 Example of an XCRF Based Application

An RSS feed generator (available at http://r2s2.futurs.inria.fr) has been built on top of XCRF. The main idea consists in using XCRF to annotate web pages with labels relative to an RSS feed (title of an article, its description, ...) and then in applying heuristics to transform annotated documents into an RSS feed.

8 Known Bugs

8.1 Namespace problems

- 1. XPATH expressions used in the definition of the features do not work with documents which have a default namespace.
- 2. When a document has two attributes of the same name in different namespaces (e.g. ns1:attr and ns2:attr), the labeling does not work correctly. Indeed, it creates two new attributes, both called slot_attr. One of them is thus overwritten.

⁴http://riso.sourceforge.net

⁵http://mallet.cs.umass.edu

⁶http://jaxen.org

⁷http://dom4j.org

⁸http://www.saxonica.com/

References

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