

# WebKER: A Wrapper Learning-based Tool for Extracting Knowledge<sup>\*</sup>

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**Abstract.** This paper proposes WebKER, a system for extracting knowledge from Web documents based on domain ontologies and suffix-array-based wrapper learning. It also gives the performance evaluation of this system and the comparison between querying information in the Knowledge Base (KB) and querying information in the traditional database. Moreover, the *outstanding*-wrapper selection and a novel method for linking and merging the knowledge are also presented.

## 1 Introduction

Wrappers are widely used for converting Web pages to structured data [1]. However, the layouts of Web pages from different websites are usually different. In addition, the layout of a specific Web page may be updated from time to time. To the best of our knowledge, among published works little is dealing with proposing complete frameworks or systems for extracting the knowledge from diverse Web pages in Chinese. Due to the lack of semantics, the traditional information depositories (XML files, tables in database etc.) are not convenient for users to do queries and the search results are usually not sufficient enough. Domain ontologies can provide machine-readable representation of meaning of information to aid the extraction [2]. Motivated by the above analysis, we propose WebKER, a domain-ontology-aided system for extracting knowledge from Chinese Web pages by employing suffix-array-based wrapper learning. Moreover, our system can be modified to deal with the Web documents in other languages if appropriate domain ontologies and the Name Dictionary (ND) are provided.

## 2 Our Approaches and Experiments

After normalizing the Web documents using Tidy<sup>1</sup> package, we first introduce a method of finding out the Information Content Blocks of Interests (ICBIs). We use regular expressions [4] to match and omit nonsignificant blocks. For instance, we can find out *Script* blocks using regular expression “<SCRIPT[^>]\*(>|\n\*)” and fulfill the omission task. Then, we compare each two lines of two documents generated from the same template. The same *lines groups* will be neglected and the ICBIs will be retained. We abandon the attributes within the tags, replace the literal content with a new tag </txt> and map each tag to an identical character according to a predefined Mapping Table (MT). Regarding documents as

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<sup>1</sup> <http://www.w3.org/People/Raggett/tidy>

strings, we create their suffix arrays [3] which help us find out the maximal hidden repeats. Since most of the extracted patterns are incomplete or redundant, we develop the criteria for selecting the *outstanding* pattern according to *tag loop*, *pattern length*, *the first tag* and *coverage percentage*. Then the *outstanding* pattern is automatically transformed into original tags according to MT. Meanwhile, `</txt>` is replaced with a regular expression `"> [^<^>]+ <"`. We can use the *outstanding* pattern to extract data. However, the data newly extracted is raw since one resource (class, property or individual) may have several synonymous names on different websites. Based on Hownet<sup>1</sup>, we establish an ND to map the original names of resources to the names predefined in domain ontologies using *binary balance tree* structure. By querying the domain and the range of a specific property, we can identify its subject and object and then generate the knowledge described with OWL<sup>2</sup>. Finally, we propose a similarity-based approach for linking and merging the knowledge before adding them to the KB.

The domain ontologies employed in our system are created by four people within ten months, including 200 classes, 265 properties and 1332 individuals. We collect Web documents randomly from five large portals and four professional websites covering finance information in Chinese. For each website, we retrieve 20 documents to extract information about corporations. We ask ten domain experts to extract information from these documents manually and finally get 894 individuals. Focusing on five websites, we ask 40 users to generate 120 queries randomly. According to the experimental results, we find that the performance of extracting information using WebKER is superior and the  $F_{measure}$  of querying the KB are all higher than those of querying the traditional database.

### 3 Conclusions and Future Work

We propose a wrapper-driven system WebKER. Based on domain ontologies and suffix-array-based wrapper learning, WebKER learns wrappers from Web documents and generates knowledge for users to do queries. Experiments on documents from large Chinese websites yields promising results. Our current-research goal focuses on improving our pattern processor by adding heuristics to the pattern discovery and selection. Our long term goal is to improve our system and make it semiautomatically extend domain ontologies within the knowledge-extraction process.

### References

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<sup>1</sup> <http://www.keenage.com>

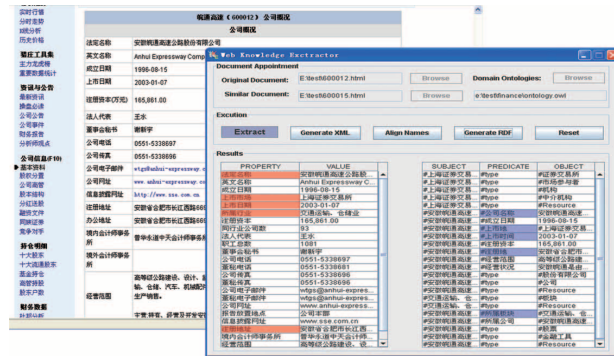
<sup>2</sup> <http://www.w3.org/TR/owl-features/>

## Explanations for WebKER

In this appendix we describe the implementation and the demo of our approach covered in the main part of this poster description.

## Implementation and Example

WebKER is implemented as a part of CRAB<sup>1</sup>. CRAB contains a set of tools such as the Web-document crawler, the page filter, the knowledge extractor, the reasoner and the report generator. After the Web documents are denoised, WebKER can automatically learn wrappers and generate knowledge. The framework for WebKER contains following blocks. *Retriever* block retrieves Web documents from the Web. Then these documents are transformed from the ill-formed expression into the well-formed expression by *Transformer* block. Two documents of the same layout are compared by *Information Block Extractor* block and the generated HTML snippets will be sent to *Translator* block. According to the MP, tags are replaced with specific characters. Then *Suffix Array Constructor* block discovers the repeated patterns hidden in the Web documents. According to the predefined criteria, *Selector* block finds out the *out-standing* pattern. Then resources can be extracted and stored in XML files. Based on the ND, these names are replaced with the predefined ones in domain ontologies by *Name Mapper* block. Finally, the knowledge is generated and merged by *Knowledge Generator* block and *Knowledge Merger* block respectively.



The left figure shows an excerpt of a Web page associated with the basic information for “安徽皖通高速公路股份有限公司” (Anhui Expressway Company Limited) retrieved from Yahoo China. Besides, a screen snapshot for our interface after the knowl-

edge extraction from this Web page is also shown in this figure. Given the similar documents and domain ontologies, we can get raw information by pressing the *Extract* button. When *Align Names* button is pressed, WebKER maps the resources’ original names to the ones predefined in domain ontologies and creates a new version of the XML file to describe this corporation. In the above figure, after mapping, the names with the orange background in the bottom left table are replaced with the ones with the blue background in the bottom right table. Then the new XML file is used for extracting the knowledge based on domain ontologies. After being linked and merged, these knowledge are added to the KB finally.

<sup>1</sup> CRAB is a project aimed at providing an integrated multifunctional system that can crawl Chinese Web documents, extract knowledge, and finally provide users with human-readable reports.