

A Survey of Multilingual Document Clustering

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Abstract: *The amount of multilingual documents generated on internet, is increasing day by day. Multilingual document clustering (MDC) is a technique of classifying documents in different languages. Classification of documents for the languages without labeled training data set is a major challenge. Two major approaches used till date are machine translation of documents for classification and use bilingual dictionaries for effective translation of trained classification models. This paper surveys various MDC challenge and techniques. The major focus is on the problem of translating documents and classifying it semantically.*

Keywords: Multilingual Text Data; Cross-lingual Text Classification, Clustering.

1. Introduction

The massive amount of multilingual documents on the World Wide Web makes the Multilingual document clustering (MDC) problem increasingly important. Typically, MDC refers to the task of classifying documents in different languages using the same taxonomy of predefined categories [1]. The Reuters News Agency, for example, has been using the same taxonomy of subject topics to index International news stories in different languages. Document clustering is defined as classification of text documents into different groups of related documents in an unsupervised manner. Automated classification of multilingual documents is obviously desirable for both cost saving and classification uniformity. However, the documents available are poorly labeled or not labeled at all thus making a MDC more complex.

2. The Multilingual Cluster Identification Problem

Multilingual document clustering approach deals with categorization of multilingual text and cross language information retrieval. Computing the relatedness between multilingual documents is the major challenge for clustering multilingual documents. Clustering is an unsupervised task but the existing multilingual document clustering techniques requires a supervised approach like dictionary, multilingual thesaurus, parallel texts, or comparable corpus etc to achieve cross-lingual semantic interoperability

3. Related Work

The work carried out in the field of Multilingual document clustering (MDC) can be broadly divided into two categories:

1. Machine translation of documents for classification
2. Use bilingual dictionaries

A) Machine Translation Techniques

Bel et al. [9] were amongst the early pioneers examining cross-lingual text categorization. They used the Rocchio algorithm, a popular learning method based on relevance feedback, and the

Winnow algorithm, a method for learning a linear classifier from labeled examples, to categorize documents in multiple languages. Roark and Fisher [5] use supervised Machine Learning approach to obtain a query focused sentence ranking. Genetic algorithms is used to carry out the summarization task by Friedman [4]. He carried out the work on English and Hebrew languages. Ling et al. [10] also translated target-language documents (Chinese web pages) to a source language (English), and predicted their labels based the labels of the English documents. Shi et.al. [11] attempted to translate classification models across languages. The model consisted of a bag of weighted terms, where the term weights were the learned model parameters based on labeled data. A bilingual dictionary is used to translate each term in the model to target language. EM algorithm was used to handle ambiguities in translation.

B) Use of bilingual dictionaries

Radev[2] use eight types of summarization algorithms for classification of Chinese and English languages only. Nidhi and V. Gupta [3] had considered sports related documents from the Punjabi News Websites as the corpus. They proposed an Ontology based classification and Hybrid Approach for creating ontology. For linguistic approach, gazetteer list was prepared for Punjabi language The method consists of Pre-processing phase, Feature Extraction phase and Processing Phase. They used new Hybrid approach along with Ontology based classification.

Latifur et.al[4] used a clustering algorithms to build a top-bottom hierarchy based on self organizing tree. WordNet and automatic concept selection algorithm was used to identify correct notion for every node in the linguistic hierarchy. Sandeep Chaware[1] proposed semantic matching approach using Q&A approach for ontology building for Hindi and Marathi languages for inference. He used synset, bi-lingual dictionary, ontology for an entered string for carrying out inference and semantic relatedness. He achieved precise results for precision and recall values for ontology construction and computing inference. Daniil [7] used Wikipedia categories and proposed an unsupervised method for bootstrapping domain ontologies. The method consists of selection of subset of concepts relevant for a Computing and Music domain, splitting

up into classes and individuals and identifying the relations between the concepts. The relationship is further classified into subclass of, instance of, part of, and generic related to. The domains of was used to evaluate the method. Saraswathi[8] proposed a system for information retrieval on festival domain for English and Tamil. The authors used ontological tree for inter- language conversion that allows user to query in their native language. Naïve algorithm was used for document search and page ranking algorithm in IR phase. Query disambiguation is done by using language grammar rules and bilingual ontology.

3.1 Limitation and Challenges

The observations from the above methods are as follows:

1. Dictionary does not cover entire vocabulary of that particular language, since new words such as proper names are created almost on a daily basis.
2. Word ambiguity also carries the potential to interrupt a clustering algorithm as generally the algorithm only picks the most frequent sense and ignores the others.
3. A multilingual thesaurus is expensive to build. Existing multilingual thesaurus which is frequently used to for multilingual document clustering is Eurovoc, is available in 22 official languages only. No support for Indian Languages available.
4. Classification of documents by machine translation method using parallel text can be done using term-by-document matrix. It creates a multilingual document space. Parallel texts are available for only a few major languages. It is costly to creat parallel texts and currently only few websites maintain parallel documents in several languages.
5. Moreover, the texts only cover limited domains. Several efforts are made to use them as supervised information souse for documents in different domains have failed to produce satisfactory results.

The table 1 provides a summary of various Multilingual document clustering (MDC) and the associated challenges.

Table 1: Summary of various Multilingual document clustering (MDC) methods

Sr.No	Method	Challenges
1	Dictionary	Word ambiguity, limitation of dictionary
2	Multilingual thesaurus	Word ambiguity, limitation of thesaurus, availability
3	Parallel Texts	Parallel text availability
4	Comparable corpora	Relies on words used in common language
5	Machine translation of documents	Dependency on translator, semantic relatedness, word ambiguity.

4. Conclusion

The problem of clustering multilingual documents (MDC) into distinct sets of groups based on their topic similarities. The goal of multilingual document clustering (MDC) is to introduce robust clustering methods which can be applied to documents in various languages. In this

paper we have discussed different ways to deal with multilingual documents. It is expected that clustering should be unsupervised .But for multilingual document clustering techniques requires the presence of supervisory information (i.e., dictionary, multilingual thesaurus, parallel texts, or comparable corpus) to achieve cross-lingual semantic interoperability). It is also observed that all the methods discussed above deal with foreign languages and very little effort is made for clustering Indian languages.

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