### **Text Segmentation for Analysing Different Languages**

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Abstract. Over the past several years, researchers have applied different methods of text segmentation. Text segmentation is defined as a method of splitting a document into smaller segments, assuming with its own relevant meaning. Those segments can be classified into the tag, word, sentence, topic, phrase and any information unit. Firstly, this study reviews the different types of text segmentation methods used in different types of documentation, and later discusses the various reasons for utilizing it in opinion mining. The main contribution of this study includes a summarisation of research papers from the past 10 years that applied text segmentation as their main approach in text analysing. Results show that word segmentation was successfully and widely used for processing different languages.

Keywords: Text Segmentation, Text Analysis, Text Processing, Languages, Reviews, Opinion Mining.

#### 1 Introduction

Segmentation is splitting a document into segments. The segment is also referred as "segment boundary" [1] or passage [2]. While another studies referred segment as subtopic [3] and region of interest [4]. There are many reasons why the splitting document can be useful for text analysis. One of the main reasons is handling those segments is easier since they are smaller and more coherent than whole documents [2]. Another reason is segments can be used as units of analysis and access [2]. Text segmentation was used to process text in opinion mining [5] [6], information retrieval [7], emotion extraction [8], sentiment mining [9] [10] and language detection [11].

This paper reviews different methods and reasons of applying text segmentation in opinion and sentiment mining, language detection and information retrieval. The target of this survey is to give an overview of text segmentation techniques with brief details. The contribution of this paper includes the categorizations of recent articles and the illustration of the recent trend of research in the opinion mining and related areas like sentiment analysis and emotion detection.

Section 2 of this paper explains the method used to review the past studies. Section 3 discusses the results of summarised articles. Section 4 concludes this paper.

# 2 Review Method

This paper is limited to thirty articles which are summarised in Table 1. It includes a summarization of past 10 years of articles from journals and conferences that involved text segmentation as their approaches. The first column contains the references [12-35] of the articles. The second column contains the year of the evaluated study. Following column briefly, describes the evaluated study. The fourth column states the type of segment used in the evaluated study. The segmentation is used for different types of document, column five contains information regarding the type of documents. The reasons for applying segmentation in particular studies are stated in the following column. The last column shows the type of language in tested documents.



# 3 Results

Table 1. Summarisation of articles.

	Yea Description				Languag
efer r		segment	documents		e
ence					
<u>S</u>	200 1	~			
[1	200 Improving text segmentation using	Sentence	e Corpus	To improve the	Belgian
2] 6					French
5.5	latent semantic analysis	Tr. (	D: 1	segmentation	CILI
[5				To identify	Chinese
] 6	summarization for			dialogue content	1
[1	dialogue style 200 HTML text		Corpus	To identify Web	Japanese
3] 6				page content web	Japanese
3] 0	page summarization		pages	page content	
[6	200 Opinion search in	Tonic	Web	To identify	English
	web blogs (logs)	ropio	blog	To identify opinion in web	Engilon
J ,	wee elegs (legs)		olog	blogs(logs)	
[8]	200 Comprehensive	Word	Commer		Chinese
1 7	information based			polarity orientation	
-	semantic orientation			in text	
	identification				
[1	200 Automatic Story	Topic	News	To identify story	Chinese
4] 8	Segmentation in			boundary	
	Chinese Broadcast				
	News				
[1	200 Aspect-based		e Reviews	To extract aspect-	
5] 9				based sentiment	
	for sentiment			summary	
F.1	summarization	337 1		T 1 'C	C1 :
[1			Corpus	To classify text	Chinese
6] 9	sentiment classification			based on sentiment value	
[1	201 An information-	Word	Blogs		Hrdu
7] 0	extraction system for			and human	Oldu
/] 0	Urdu-a resource-poor		news	behaviour within	
	language		articles	text	
[9		Word		To classify news	Chinese
1 0					
	news			orientation	
[1	201 Sentiment text	Word	Commen	To improve	Chinese
0] 0	classification of	•	ts	accuracy of	
	customers			sentiment	
	reviews on the web			classification	
	based on SVM				
[1	The application of		Web	To analyse	Chinese
8] 0	text mining technology		documents	sentiment in text to	
	in			monitor public	
	monitoring the			network	
	network education				
Г1	public sentiment	Ward	Га	To doctor - 44	Chinass
01 0	201 Using text mining		Forums	To design a text	Chinese
9] 0	and sentiment analysis for online forums			sentiment approach	
	hotspot detection and				
	noispoi detection and				

forecast

		A topic modelling perspective for text segmentation.	Topic	Corpus	To design an enhanced topic extraction approach	English
[2 1] 1	201	Text segmentation of consumer magazinesbl	Text ocks ir	Articles n PDI	To process PDF	English
		in PDF format	d	ocuments		
[2 2] 1		Rule-based Malay text segmentation tool	Sentence	Articles	To design Malay sentence splitter and tokenizer	Malay English
[2	201	Usage of text	Passages	Articles		English
3] 2		segmentation	1 4554505	11111111111	document clustering	Enghon
-,		and inter-passage similarities				
[2	201	Two-part	Word	Corpus	To process	English
4] 2		segmentation of text			problem and solution	
		documents			documents	
[2					To combine	Ancient
5] 2		segmentation	1	documents	s the strengths of	
		in historical			top-down and	
		documents			bottom-up approaches	
[2	201	Topic segmentation	Tonic	News	To improve	Chinese
		of Chinese text based	Торго	1.05	method of	Cimicoc
~1 -		on lexical chain			processing text	
[2	201	Semantic-based text	Text	Web	To retrieve image	English
7] 3		block segmentation bl	ocks p	age	based on text around	
					it	
[2		Segmentation	Tag	Reviews	2 3	English
8] 3		system based on the	Word		which identifies a	
		sentiments expressed in the text.			sentiment expressed in text/	
[1	201	Recognition-based	Word	Dataset		Arabic
1] 4		segmentation of	Word	Dataset	Arabic text within	THADIC
-1 .		online Arabic text			handwriting	
		recognition			S	
[2	201	Text segmentation	Sentence	Forums	To identify	Greek
9] 4		for language	Topic		language	English
		identification in Greek				
F2	001	forums	C1 .	<b>C</b>	T :1 ::0	CI.
		Chinese text	Characte	Corpus		Chinese
0] 5		sentiment orientationr identification			sentiment in the text	
[3	201		Word	Articles	To enhance	English
1] 5		based on Semantic	Word	THRICIOS	semantic word	Diigiisii
1		word embedding			embedding approach	
[3	201		Word	Microblo	To support a	Chinese
2] 5		classification based	g	S	sentiment	
		approach for sentiment			classification	
FO	201	classification	W/ 1	D:-41	approach	<b>1</b> 7: -4
[3	201		Word	Dictional	r To check how dictionary sizee	
3] 6		segmentation	16	es	affects word	5C
					segmentation word	
					2-51110111011011	

[3 201 Phrase-level		Phrase	Dataset To balance English
4] 6 segmentation	and		between the word
labelling			and sentence levels
[3 201 Akkadian	word	Word	Corpora To improve the Ancient
5] 6 segmentation			language processingAkkadian
			in cuneiform

Table 1 presents the summarisation for the review of past years' studies. Different types of segmentation are discussed. For instance, topic segmentation has been successfully applied in tackling the problem of information overload that occur when the whole document is presented at once. Misra et al. [20] stated the reason behind splitting document can be reasonable to present only the relevant part(s) of a document, because presenting the whole document without segmentation may result in information overload. Paliwal and Pudi [23]addressed the same problem. Which led them to propose a clustering approach based on topic segmentation. Topic segmentation is popular in opinion mining area. For instance, studies of [20] [6] [26] used the topic as a segment.

#### DIFFERENT LANGUAGES USED IN TEXT SEGMENTATION

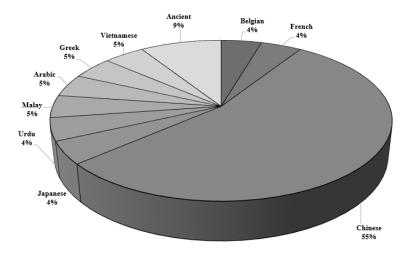


Fig. 1. Percentage of different languages used for text segmentation.

Another type of segmentation is word segmentation, Homburg and Chiarcos [35] describe word segmentation as the most elementary task in natural language processing of written language. This type of segmentation was applied in language detection. Figure 1 illustrates the numbers of percentage for each language beside English used in evaluated studies. For instance, studies of [5] [8] [9] [10] [16] [18] [19] [30] [32] used word (character) segmentation for analysing Chinese text. Beside the Chinese language, there are studies which applied word segmentation for Urdu[17], Arabic [11], Vietnamese [33], and Akkadian [35]. However, other studies [13][29][22] applied sentence segmentation to analyse Japanese, Greek and Malay languages accordingly. As it is seen, there is a trend to apply text segmentation in the analysing text in different languages.

#### TYPES OF SEGMENT USED FOR DIFFERENT DOCUMENTS

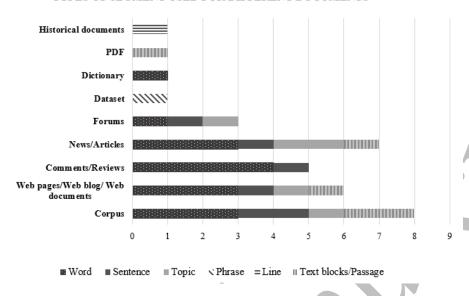


Fig. 2. Chart of different types of segments used for different types of document.

Different types of the document and datasets were used in research experiments in order to check text segmentation accuracy. Figure 2 presents a number of each type of segments used for different types of document derived from Table 1. In this study, web pages, web blog and web documents are categorised as one group. By comparison, it is the most used type of document referring to the Figure 2. After web pages, web blog and web documents, the second widely used type of document is comments and reviews. Segments can be classified into the tag, word, sentence, topic, phrase and any information unit. Figure 2 concludes that word is the most used type of segment.

As a result, we noticed the trend of applying text and sentence segmentation in processing and analysing different languages such as Chines, Vietnamese, Urdu, Arabic, and Ancient languages. Besides applying text segmentation for different languages, text segmentation successfully applied in opinion mining for news, blog and stock market. Finally, word segment is the most used compare to another types of the segment. The reason can be an as smaller segment to process as more detailed analysis can be done.

## **4 Conclusion**

This paper presents an overview of the text segmentation methods and reasons in text processing and analysing. Thirty published articles for past 10 years were categorised and summarised. Those articles give contributions to text processing in information retrieval, emotion extraction, sentiment mining and language detection.

Results show that word as the segment is the most used compare to other types of the segment. It means that processing smaller segments can be more useful and meaningful for deeper and more detailed analysing of the text. Different types of document are used as a dataset for the experiment. The most popular are web pages, web blog and web document following by comments and reviews. That indicates that information from the online users and consumers plays an important role in expressing people's emotions, opinions and feelings.

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