# Analysis of Titles and Readers – For Title Generation Centered on the Readers

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#### Abstract

The title of a document has two roles, to give a compact summary and to lead the reader to read the document. Conventional title generation focuses on finding key expressions from the author's wording in the document to give a compact summary and pays little attention to the reader's interest. To make the title play its second role properly, it is indispensable to clarify the content ("what to say") and wording ("how to say") of titles that are effective to attract the target reader's interest. In this article, we first identify typical content and wording of titles aimed at general readers in a comparative study between titles of technical papers and headlines rewritten for newspapers. Next, we describe the results of a questionnaire survey on the effects of the content and wording of titles on the reader's interest. The survey of general and knowledgeable readers shows both common and different tendencies in interest.

#### 1 Introduction

The title is expected to play two roles. One is to give the reader a very compact summary of the document, and the other is to attract the target reader's interest and lead the reader to read the document. It is preferable that a title plays both roles, because the reader may be disappointed with a gap between the title and the document if the title plays the former role poorly, and the reader may not read the document if the title plays the latter role poorly. Therefore, it is very important what title is attached to a document.

Several techniques have been reported on generating titles (Jin and Hauptmann, 2000)(Berger and Mittal, 2000), and they focus on the former role, that is, to give a compact summary. The main approach is to find a few keywords from the document by calculating the importance of each word in the document. This approach, incidentally, is similar to most text summarization techniques. The selected keywords or title strongly reflect the author's wordings. In other words, this approach is an "author-centered approach". In some cases, the title generated by this approach might play the latter role poorly and fail to get the reader's interest.

To make generated titles play their latter role properly, it is not sufficient to look into only the author's document. It is important to also pay more attention to the reader. It is necessary in the "reader-centered approach" to clarify the features of the reader's attention, that is, the relationship between the reader's attention and the content and wording of the title. Based on this knowledge, it will be possible to extract information from the document that is more attractive to the reader than the author's key expressions and to include it in the generated title.

Our first goal is to clarify the kind of content and wording that are key to getting the reader's comprehension, interest in, and positive feeling toward the document. For this purpose, we first conducted a comparative study on the titles of technical papers and headlines rewritten for newspapers to identify the typical content and wording of titles aimed at general readers. We then conducted a questionnaire survey on the effects of different content and wording of titles on different kinds of readers' interest.

The following sections are as follows: section 2 describes the comparative study and its results, section 3 and 4 explain the details and the results of our questionnaire survey, and section 5 relates our conclusion and future work.

## 2 Comparison between Paper Titles and Newspaper Headlines

To identify the typical content and wording of titles aimed at general readers, we conducted a comparative study on the Japanese titles of research papers and the headlines of Japanese newspaper articles describing the corresponding technology.

We first divided the titles and headlines into several syntactic components (text segments) and assigned each component a syntactic function tag, such as "P(urpose of development)" and "M(ethod for realization)", and then comparatively analyzed the expression of paper title and headlines on the basis of each component.

# 2.1 Overview of Collected Documents

Table 1 shows the outlines of collected documents, including research papers (articles and technical reports) and newspaper articles (from three trade newspapers and one general newspaper). The Japanese titles and headlines were retrieved from a document database at a research institute. They cover science and technology at large.

We identified one or a few technical papers closely related to about 90% of the headlines.

# 2.2 Syntactic Function Tags

We found that most text segments of the collected titles and headlines could be classified into the following syntactic function tags. Here, we define each syntactic function tag and describe the tagging process we used in the analysis.

- **B**(ehavior): Behavior is expressed by a verbal noun or verb. For example, in the title "Development of an Exploration System of Buried Cables", the word "exploration" describes the main behavior or action of the developed technology and is assigned the tag "B".
- **O**(bject): The object is a noun phrase in the objective case of the verbal noun of behavior "B". In the above example, the compound noun "buried cables" is assigned the tag "O".
- **T**(echnology type): The words assigned the tag "T"(echnology type) are very restricted and include such words as "system", "model" and "method". They express the form of the developed technology.

- **P**(urpose): The purpose of development is usually expressed by a noun phrase following a preposition, such as "for" ("no tame-ni/no" in Japanese). (e.g., "for power distribution cables under pavements")
- **M**(ethod): The tag "M" stands for the method for realization and is expressed by a noun phrase following a preposition, such as "by" ("*ni yori*" in Japanese). (e.g., "by underground radar")
- S(trong point): "S" stands for the advantage or merit of the developed technology. It is usually expressed by an adjective or adverb phrase. (e.g., "highly accurate").
- **D**(evelopment): "D" stands for the expression that frequently appears in paper titles and headlines, such as "the development of", "the evaluation of", and "a study on".
- **E**(t alia): There are several text segments that do not fall into the above seven categories. They appear mainly in newspaper headlines. Two examples are names of development organizations and descriptions of the issue for practical use of the technology.

We excluded the two tags "D" and "E" in a comparative analysis because they do not directly relate to the content of the developed technology.

# 2.3 Tagging Process

As for paper titles (in Japanese), we divided them semiautomatically according to the following pattern

P? M? S? O S? B S? T? D? (Each alphabet means syntactic function tag. "?" means "either zero times or one time".)

using the "ChaSen" Japanese morphological analyzer (Asahara and Matsumoto, 2000) and syntactic clues (such as word order, syntactic category and specific prepositions). The results are reviewed and errors are manually corrected.

As for headlines, automatic tagging is difficult because of the frequent use of verbal omissions and inversion. Therefore, we manually divided the headlines. In order to improve the precision of human tagging as highly as possible, the human tagger divided them according to the following procedure.

1. Find the verbs (or verbal nouns).

Table 1: Features of Documents Used in the Comparison of Their Titles or Headlines

	Kind of		Target	Author	Publication	Number of
	Documents		Reader		Date	Documents
1	Article		Researcher	Researcher	'89–'00	1464
2	Technical Report		General	Researcher	'80–'00	2861
			Reader			
3	Trade	on the Power Industry				531
4	Newspaper	on Technology	General	Newspaperman	'88–'98	313
5		on the Economy	Reader			203
6	General Newspaper					364

 Table 2: Components Included in the Title of Technical Papers

	Each Syntactic Compo-	Syntactic Cat-	Specific Expression or	Frequency
	nent's Function	egory	Preposition	
В	Behavior of the Technology	Verbal Noun	-	> 80%
0	Object of the Behavior	Noun Phrase	Japanese particle "wo"	> 80%
Μ	Method for Realizing	Noun Phrase	Japanese expression "ni yori",	< 30%
			etc.	
			(such as "by" in English)	
S	Strong Point	Adjective/Adverb	-	< 30%
		Phrase		
Р	Purpose of Development	Noun Phrase	Japanese expression "no tame	< 30%
			ni/no", etc.	
			(such as "for" in English)	
Т	Technology type	Noun	-	58%
D	Development	Noun	Japanese expression "no kai-	
			hatsu", etc.	
			(such as "development of")	

- 2. Determine the verb (or verbal noun) which corresponds to "B" using syntactic and semantic clues (such as special prepositions and semantic modification relations).
- 3. Identify the other components which modify "B" using the clues used in the above step 2.

#### 2.4 Comparative Analysis

We analyzed the results of the above tagging in the following two ways.

- 1. The difference in the frequency of the six main components with tag B(ehavior), O(bject), M(ethod), S(trong point), P(urpose) and T(echnology type) in paper titles and headlines.
- 2. The difference in the expression of the same syntactic components in paper titles and headlines.

#### 2.5 Obligatory and Optional Components

The last column in Table 2 indicates the frequency of the occurrence of each tag in titles and headlines. The components (text segments) with tags "B", "O", and "T" appear more than 80%, 80%, and 58%, respectively, in titles and headlines <sup>1</sup>. We call these high-frequency components "obligatory component" and the other components with "P", "M", and "S", "optional components".

#### 2.5.1 Obligatory Components

Obligatory components are important because they are essential in reporting the substance of the technology to the reader.

By comparing the expression of the obligatory components (labeled "T", "B", and "O"), we categorized the difference of the expression into two points. One is that technical jargons are used in paper titles while plain terms are used in headlines to express the same thing. The other is that in the obligatory component the title explains the concrete content of the tech-

 $<sup>^1\,{\</sup>rm ``B"}$  and ``O" appear 100% in the paper titles and 80% in the headlines because verbal omissions sometimes occur in newspaper headlines.

nology while the headline expresses the purpose of the technology, which general readers can understand.

In other words, we identified two expressing techniques of newspapermen.

- Instead of using technical jargons, the plain synonymous terms are used.
- Instead of expressing what the technology does, they express what the purpose of the technology is.

An example of the former in English is as follows:

Title: Method to Shorten Radioactive Half-life

**Headline:** Method to Shorten the Duration of Radiation

An example of the latter is as follows:

Title: Method to Shorten Radioactive Half-life

**Headline:** Method to Shorten Storage Period of Radioactive Waste

The expression patterns typical in obligatory components are summarized in Table 3. It is arranged from the two viewpoints of "what to say" and "how to say".

#### 2.5.2 Optional Components

By comparing the expression of the optional components, in the "M" component we found that technical jargons are frequently used in paper titles while plain terms are used in headlines. Moreover, by analyzing the frequency of component combinations, we found that the combination of optional components with "M" and "S" is seldom used in any title or headline. We also found that the use of "M" in titles is more frequent than in headlines while the description of the advantages ("S") in headlines is five times more frequent than in titles. The analysis suggests that the description of "M" found in paper titles are omitted in headlines and the description of advantages ("S") are used in headlines.

The expressing techniques we identified are as follows:

- Instead of using technical jargons, the plain synonymous terms are used in the "M" component.
- Instead of expressing the method of realizing the technology, they express the advantage ("S") of the technology.

An example of the former in English is as follows.

- **Title:** Method to Shorten Storage Period of Radioactive Waste by Metallic Fuel FBR
- **Headline:** Method to Shorten Storage Period of Radioactive Waste by Burnout

An example of the latter is as follows:

**Title:** Method to Shorten Storage Period of Radioactive Waste by Metallic Fuel FBR

**Headline:** Method to Shorten Storage Period of Radioactive Waste by 1/10000

The expression patterns typical in optional components are summarized in Table 4. The table is also arranged from the two viewpoints of "what to say" and "how to say", as in Table 3.

## 3 Questionnaire Survey

In this section, we explain the details of our questionnaire survey.

#### 3.1 Viewpoint of the Survey

We assume that the factors which affect the reader's impression of a title which expresses newly developed technology are the following:

- F1 Mode of expression for titles (in other word, the expression patterns)
- **F2** Whether or not the reader has an interest in the technical field
- ${f F3}$  The reader's level of expertise in the technical field

Therefore, in order to clarify what kind of impression the title based on each expression pattern (F1) gives the reader, we should investigate how the impressions that each reader who differs in F2 and F3 receives change with each expression pattern. We then prepared our questionnaire survey according to the following procedures.

- 1. Select the technical fields for the survey (we selected three fields: electric transmission, architectural engineering, and environmental science).
- 2. Categorize the respondents by their interest in each technical field and their expertise in that field.
- 3. Generate titles describing new technologies in the three technical fields by using expression patterns

What to	Pa	Pattern 2	
say	(What the	(What the purpose of the	
		technology is)	
How to	Pattern 1.1	Pattern 1.2	Pattern 2.0
say	(Using technical jargon)	(in plain terms)	(in plain terms)
T(ype)	Method	Method	Method
B(ehavior)	to Shorten	to Shorten	to Shorten
O(bject)	Radioactive Half-life	the Duration of Radiation	Storage Period of Ra-
			dioactive Waste

#### Table 3: Expression Patterns in Obligatory Components

 Table 4: Expression Patterns in Optional Components

What to	Patte	Pattern 4		
say	(What the method of realizing the technology is)		(What the strong point	
			of the technology is)	
How to	Pattern 3.1	Pattern 3.1 Pattern 3.2		
say	(Using technical jargon)	(in plain terms)	(in plain terms)	
T(ype)	Method	Method	Method	
B(ehavior)	to Shorten	to Shorten	to Shorten	
O(bject)	Storage Period of Ra-	Storage Period of Ra-	Storage Period of Ra-	
	dioactive Waste	dioactive Waste	dioactive Waste	
M(ethod)	by Metallic Fuel FBR	by Burnout		
S(trong Point)			by $1/10000$	

4. Draw up a questionnaire which asks the respondents what kind of impression they had when they read each generated title.

In the following three subsections, we explain the details of the above procedures step 2, 3 and 4, in order.

# 3.2 Categorization of Respondents

In order to categorize the respondents by their interest in each technical field and their expertise of that field, we asked the respondents two questions in the preliminary questionnaire.

One asked them if they were concerned/unconcerned with one of the three technical fields, and the other asked them about their main source of information (three options: general newspaper, trade newspaper, and academic journal, were given, if they were concerned).

We categorized them into two types ("Unconcerned" and "Concerned") by the former question. We then categorized "Concerned" into three types ("Commoner", "Engineer" and "Researcher", whose main sources of information are general newspaper, trade newspaper and academic journal in turn.) by the latter question. We labeled "Unconcerned" and three types of "Concerned" ("Commoner", "Engineer" and "Researcher") as readership. Table 5 shows the number of respondents by readership.

# 3.3 Titles Prepared for Our Questionnaire

In this section, we explain the method for composing the titles used in the questionnaire. The procedure for composing the titles follows.

- 1. Select three new technologies in each of the three technical fields, which were developed in a research institute.
- 2. Retrieve the phrases of titles and headlines concerning each technology, from the document database of the institute, that correspond to each expression pattern.
- 3. Combine the phrases to compose twelve titles per each technology, using three types of obligatory component expression pattern of by four types of optional component expression pattern (including a pattern without optional components). The total number of the titles per one field is 36 (twelve titles by three fields).

		1		
	Unconcerned	Concerned		
		Commoner	Engineer	Researcher
Electric Transmission	151	114	69	48
Architectural Engineering	168	115	62	45
Environmental Science	108	153	71	53

**Table 5: Number of Respondents** 

We divided thirty six titles per each field into four groups (each group consists of nine titles). The breakdown of the nine titles is three types of obligatory component expression pattern by three types of optional component expression pattern. We randomly divided the respondents of each readership into four groups and then asked four groups of the respondents about the impression of four groups of the titles respectively.

#### 3.4 Contents of Our Questionnaire

In order to investigate whether each prepared title is effective in getting each readership's comprehension, positive feelings, and interest, we asked the respondents the following questions in turn.

- Do you think the title is comprehensible?
- Do you feel positive toward the technology after reading this?
- Do you want to know more about the technology?

#### 3.5 Method

Respondents to the questionnaire were the staff of a research institute and monitors of a marketing research firm. We asked them to answer our questionnaire on a Web page which is prepared for this survey.

## 4 Difference in Impression According to Obligatory Component Expression Pattern

In this section, we report on the analysis of the correlation between the obligatory component expression pattern in titles and each readership's impression of the titles.

Figure 1 shows the graph of the percentage of titles regarded as "comprehensible" by the respondents with each readership using each expression pattern. Figure 2 and 3 also show the ones regarded as "evoked positive feelings", "interesting" respectively. We also made a 3x2



Figure 1: Percentage of Titles That Respondents Regard as Comprehensible







Figure 3: Percentage of Titles that Respondents Regard as Interesting

and Cramer's means the value calculated by Cramer's V.)						
		Unconcerned	Concerned			
			Commoner	Engineer	Researcher	
Comprehensible	Chi-square	1%	1%	1%	1%	
	Cramer's	0.62	0.59	0.38	0.43	
Able to Evoke	Chi-square	1%	1%	1%	1%	
<b>Positive Feelings</b>	Cramer's	0.45	0.45	0.22	0.24	
Interesting	Chi-square	1%	1%	1%	5%	
	Cramer's	0.27	0.35	0.22	0.1	

 Table 6: Results of the Chi-square Test and Cramer's V

(In this table, "Chi-square" means the significant level tested by the Chi-square, and "Cramer's" means the value calculated by Cramer's V.)

contingency table (expression patterns  $\times$  yes/no answer on impressions) for each impression and each readership and calculated the significance level of the  $\chi^2$ -test and the Cramer's V<sup>2</sup>.

Because all significance levels in Table 6 are under 5%, it is confirmed that there exists associations among expression patterns and impressions for each readership.

However, the strength of the associations is low as for the respondents with readership "engineer" or "researcher", who have expertise, because of lower values of Cramer's V, while the strength of the association is high as for those who has readership "unconcerned" or "commoner" because of higher values of V.

Because all graphs slope up from left to right in Figures 1, 2 and 3, the expression pattern 2.0 (expressing what the purpose of the technology is) is the most effective to make a title impressive (more precisely, regarded as "comprehensible", "evoked positive feelings" and "interesting") for readers with most of readership, especially the "unconcerned" readers or "commoner". As for the readers with expertise, other types of expression patterns such as 1.1 or 1.2 should also be considered because of their flatter slopes.

#### 5 Conclusion and Future Work

We emphasized the need for title generation centered on the reader and identified the typical content and wording of titles aimed at general readers by conducting a comparative study on paper titles and headlines. Moreover, we verified the effects of different content and wording of titles. As a result, titles using expression pattern 2.0 (expressing what the purpose of the technology is) in obligatory component is the most effective in getting the general reader's comprehension, positive feelings, and interest. However, the more expertise in a technical field the reader has, the less the reader tends to be influenced.

In future work, we will verify the difference in impression according to optional component expression patterns by analyzing the results of our questionnaire survey. We plan to establish the method for generating a title by extracting phrases from the body text and combining them, which correspond to the expression pattern which is effective in getting target reader's interest.

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 $<sup>{}^{2}</sup>V = \sqrt{X2/N(k-1)}$  where N = total number of cases in the table; k = number of rows or columns, whichever is smaller. Cramer's V ranges 0 to 1 where 0 means that the two value variables are perfectly unrelated and 1 means that they are perfectly related.