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An Automated Bengali Text Summarization Technique Using Lexicon Based Approach

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Abstract. There are enough resources for English to process and obtain summarized documents. But this thing is not directly applicable for Bengali Language as there is lots of complexity in Bengali, which is not same to English in the context of Grammar and sentence structure. Again, doing this for Bengali is harder as there is no established tool to facilitate research work. But this is necessary as 26 crore people use this language. So, we have gone for a new approach Bengali document summarization. Here, the system design has been completed by preprocessing the i/p (input) doc, tagging the word, replacing pronoun, sentence ranking respectively. Pronoun replacement has been added here to minimize the rate of swinging pronoun in the output summary. As the pronoun replacement we have gone ranking sentences according to sentence frequency, numerical figures (both in digit and word version), document title. Here if the sentence has any word that exists in title also taken into our account. The similarity between two sentences has been checked to deduct one as that causes less redundancy. The numerical figure also makes an impact so they were also identified. We have taken over 3000 newspaper and books documents words has been trained according to grammar. And two documents has been checked by the design system to evaluate the efficiency of designed summarizer. From the evaluation system it is been found that the Recall, Precision, F-score is 0.70 as it is 70%, 0.82 as it is 82%, 0.74 as it is 74% respectively.

Keywords: Text Summarizer, BTS, Bengali, NLP, Python, Machine Learning, POS Tagging.

1 Introduction

Text summarization is the process of summarizing a text or document. There are many summarization tools for the English language. There are also some tasks for automated Bengali text or document summarization. From an application standpoint the tools do not seem to be very suitable. The abstracts are categorized in two ways:

the extractive and the abstractive approach. . Most of the summarizer methods for Bengali text summarization are extractive [3]. In an automated text summarization process, a text is delivered to the computer and the computer returns a less-than-redundant extract or abstract of the original text (s). Text abstraction is the process of producing an abstract or a summary of an extract by selecting a significant portion of the information from one or more texts [1-3]. Thus, the overview summarizes the meaning of the extremes, and some time extraction results in data loss. These methods are not also able to create a plain text from related hierarchical texts. Extract summarization is less like complexity when it comes to favorite issues than abstracts for less complexity. We can use the grammatical rules in conjunction along with mathematical rules for making sentences to decrease the unnecessary error. Alternatively, for creating new and plain text from multiple texts that enables to reduce the size of the text summary [4]. Rafel, et al. told the extractive summarizer states all the basic requirements. This method has three structures: text analysis, ranking /scoring sentence and summarization [5].

2 Literature Review

The observation of summarization of Bangla language for only a document is shown in this sector. However the area of Bangla text summarization was begun several years back as a new research. Previously, most of the work in the text summarization domain was done on the basis of sentence prohibition. The survey of different text summarization techniques are proposed as the article method [3]. They accomplished an analysis of various methods for text and implemented the basis of extraction Bangla text summarizer.

According to the proposed method of K. Sarkar [4], which provides a summary of a text without reading full text. The main steps in his method has (i) preprocessing, (ii) scoring /ranking sentence and (iii) generating summary. It has also term frequency (TF), inverse document frequency (IDF) and Positional Value (PV).

The presented method of M. M. Haque et al. [5], it summarized Bangla document by using an extraction based summarization technique. The four major steps of their method is given here: (i) preprocessing, (ii) scoring /ranking sentence, (iii) sentence clustering, (iv) generating summary.

M. I. A. Efati et al. [6] suggested a summarization method as an extraction based which acts on the Bangla documents. At the same time, it is capable of summarizing a single document. It has two major steps in their proposed method: (i) preprocessing, (ii) scoring /ranking sentence & summarization.

The method of A. Das and S. Bandyopadhyay [7] presented, the identification of sentiment from the text, combine it and lastly signify the text summarization. They used a sentiment model to restore and integrate sentiment. The integration is based on the presentation of theme clustering (K-means) and document level theme relational graph algorithms and finally generates summary selected by the standard page rank algorithm for data retrieval.

3 Suggested Method

For successfully we have employed two tagging system. One is general tagging system and another is Special tagging system. The special tagging system makes the thing best and updated.

3.1 General Tagging

Every word is made to tag (like noun, pronoun, adjective, verb, preposition, etc.). by using a lexicon database [1] and SentiWordNet [2]. The lexicon database and SentiWordNet has limited number of predefined words. Using lexicon database, the words can be tagged as 'JJ' (Adjective), 'NP' (Proper noun), 'VM' (Verb), 'NC' (Common Noun), 'PPR' (Pronoun), etc. On the other hand, SentiWordNet has list of words with tag as 'a' (Adjective), 'n' (Noun), 'r' (Adverb), 'v' (Verb), 'u' (Unknown). Based on these predefined lists of words, we have experimented on 200 Bangla news documents and found that 70% words can be tagged. Bangla words (especially verb) are very much interesting [3]. Though we use word stemming to identify the original term of the word, 100% inactive verbs can't be stemmed. In fact, it is very difficult to identifying verb because there are many suffixes in Bangla. For example, basis on the tense and person, the English words "do" may be "doing", "did" and "does", but on the other hand the word may have different forms in Bangla. To consider the present continuous tense Like, "কর" (kor-do) three main forms of this word can only have depend on the first, second and third person. Also it can be "করছি" (doing) for first person, "করছ" (doing) for second person and "করছেন" (doing) for third person respectively. To consider the present continuous tense Like, "কর" (kor-do) three main forms of this word can only have depend on the first, second and third person. Also it can be "করছি" (doing) for first person, "করছ" (doing) for second person and "করছেন" (doing) for third person respectively. The forms of verbs for all these meanings of "you" in Bangla are also different. For instance, all these meanings for the forms of verbs of "you" are also different in Bangla. As, "আপনিকরছেন" (you are doing), "তুমিকরছ" (you are doing), "তুইকরছিস" (you are doing) where those terms are specified in present continuous tense and also with second person. Thus the word "কর" (do) may have the given forms: "করে" (do), "করেন" (do), "করিস" (do), "করি" (do), "করছে" (doing), "করছেন" (doing), "করছ" (doing), "করছিস" (doing), "করছি" (doing), "করেছে" (did), "করেছেন" (did), "করেছ" (did), "করেছিস" (did), "করেছি" (did), "করুক" (do), "করুন" (do), "করল" (did), "করলেন" (did), "করলে" (did), "করলি" (did), "করলাম" (did), "করত" (do), "করতেন" (did), "করতে" (did), "করতিস" (did), "করতাম" (did), "করতেছি" (doing), "করতেছ" (doing), "করতেছেন" (doing), "করছিল" (doing), "করছিলেন" (doing), "করছিলে" (doing).

(doing), “করছিলি” (doing), “করছিলাম” (doing), “করেছিল” (doing), “করেছিলেন” (doing), করেছিলে (doing), “করেছিলি” (doing), “করেছিলাম” (doing), “করবে” (do), “করবেন” (do), “করবি” (do), “করব” (do), “করো” (do). Thus, there is no any comparison between the complexity of verb in Bangla and English. However, verb identification is very important for language processing because the verb is the main word of a sentence. So, the complexity of verb in Bangla can't be compared with English. A list of suffixes are considered as for the final checking in following: “ইতেহিস” (itechhis), “তেহিস” (techhis), “ ইতিস” (itis), “ ইলো” (ile), “ইবি ” (ibi), etc. Now, if the word has suffix, it is tagged as a verb. The result of word tagging has been improved from 68.12% (before using the list of suffixes [4]) to 70% (after using the list of suffixes). We get some preliminary tagging in this step and later it may be updated in the next steps and also along with certain words will be specifically tagged as acronym, named entity, occupation, etc. in the next step [17-20].

3.2 Special Tagging

After general tagging, special tagging was introduced to identify the words as acronym, elementary form, numerical figure, repetitive words, name of occupation, organization and places.

1. Examining for English acronym: When the words are formed by the initials of the other words then it is called acronym. Such as, “ইউএনও” (UNO), “ওআইসি” (OIC), “ইউএসএ” (USA), etc. For examining these kinds of words, when we can separate these words that like: “ইউএনও” (UNO) to match with “ইউ” (U), “এন” (N), “ও” (O), those are matched every letter of the words. Actually we can write all English letters in Bangla like: A for (“এ”), B for (“বি”), C for (“সি”), D for (“ডি”), W for (“ডাব্লিউ”), X for (“এক্স”), Y for (“ওয়াই”), Z for (“জেড”) and if we can sort them by descending order depend on their string lengths where W (“ডাব্লিউ”) will be in the first place and A (“এ”) will be in the last place, then match every letter of the words. It is important in descending order that is always used to ensure the longest match. Such as, “এম” (M) does not match with “এ” (A), but it will match with “এম” (M). This experiment shows that 98% success rate for this case.

2. Studying for Bangla elementary tag: Bangla letters with spaces, like: “আকম” (A K M), “এবিম” (A B M), etc. These letters will be tagged as Bangla primary tag. We have gotten based on research; the accuracy of the elementary result is 100%.

3. Studying for recurrent words: Recurrent words are special form of word combination where same word can be placed for two times consecutively. For

example, ‘‘ঠাণ্ডাঠাণ্ডা’’ (thandathanda - cold cold), ‘‘বড়বড়’’ (boroboro - big big), ‘‘ছোটছোট’’ (chotochoto - small small), etc. There are some words, they are partially repeated such as ‘‘খাওয়াদাওয়া’’ (khawadawa - eat). We have found 100% accuracy on identifying recurrent/repetitive words.

4.Studying for numerical digit: There are three conditions for recognizing the numerical representation in words and digits, are examined as follows:

a) It is formed by following the first part of the word, like as, 0 for (০), 1 for (১), 2 for (২),....., 9 for (৯) or ‘‘এক’’ (one), ‘‘দুই’’ (two), ‘‘তিন’’ (three), ‘‘চার’’ (four) to ‘‘নিরানব্বই’’ (ninety nine). The decimal point (.) is also considered when examining the numerical form from digits.

b) The next part (if any) is followed by: ‘‘শত’’ (hundred), ‘‘হাজার’’ (thousand), etc.

c) Finally, it can have suffixes such as, ‘‘টি’’ (this), ‘‘টা’’ (this), ‘‘এন’’ (en) etc.

After the experiment on our sample test documents, 100% numerical form can be found from both numerical values and text documents.

5.Studying for name of occupation: Occupation has a significant word and for the human named entity identification, occupation is very much helpful by which named entity can be recognized. If we get any word as occupation, we may consider the immediate next some words to find out named entity. We have retrieved some entries for the occupation of Bangladesh from a table such as, ‘‘শিক্ষক’’ (shikkhok - master), ‘‘সাংবাদিক’’ (sangbadik-journalist), etc. Every word has matched with these words (that we collected from different online source) and if any matches are found then tagged as occupation. Here, ‘‘শিক্ষক’’ (shikkhok- master) will turn into ‘‘প্রধানশিক্ষক’’ (prodhanshikkhok-Head master), and so on. From this study, it may identify 96% for occupation.

6.Studying for the name of organization Name of organization is an important factor where any type of word may be the element of organizational name. From our analysis it has been mentioned as follows:

a) The following complete name of the organization, which is depended on the acronym of the name that is together with this parenthesis. For example, ‘‘দূর্নীতিদমনকমিশন(দূদক)’’ ‘‘DurnitiDomonCommission(DUDOK)AntiCorruptionCommission(ACC)’’.

(b) The organization name with last part may contain certain words. Such as, ‘‘লিমিটেড’’ (limited-limited), ‘‘বিদ্যালয়’’ (biddaloy school), ‘‘মন্ত্রণালয়’’ (montronaloy-ministry) etc. [93]. Along with the above point. If any such of words are presented in the text according to the point (b), then immediately check the three words of the particular word. Uncertainty when the words are found as noun, name entity or any

blocked word then call them the organizations name. It is found that the organizations name may be accepted the basis of point (b) 85% times.

7. Studying for name of place: There is a table then name of places of Bangladesh, it is made with 800 names for the list of division, district, upazila and municipality. Here the top level is division, second level is district and third level is upazila or municipality in area based separation. In addition, we have analyzed 230 countries names and their capitals. In this way, about 91% of the place names can be identified in our experiment.

4 Experimental Results

Sample input

Title: দুইভাই-বোনের ময়নাতদন্ত হয়েছে, মামলা হয়নি

Text:

রাজধানীর বনশ্রীতে দুই ভাই বোনের রহস্যজনক মৃত্যুর ঘটনায় এখনো মামলা হয়নি। শিশুদের বাবা মামলা করবেন বলে জানিয়েছে পরিবার। দুই শিশুর লাশের ময়নাতদন্ত হয়েছে। তাঁদের গ্রামের বাড়ি জামালপুরে লাশ দাফন করা হবে। খবরের নমুনা পরীক্ষার ফলাফল এখনো পাওয়া যায়নি। শিশুদের বাবা আমান উল্লাহ রব্বুল্লাহী ছিল ইসলাম আজমল্লার বেলোসোয়া ১১ টার দিকে প্রথম আলোকে এসব কথা জানিয়েছেন। রা মপুরা থানার ভারপ্রাপ্ত কর্মকর্তা (ওসি) রফিকুল ইসলাম বলেন, এখনো মামলা হয়নি। পরিবারের পক্ষ থেকে আজ মামলা হতে পারে। জিজ্ঞাসাবাদের জন্য চায়নিজ রেস্টোরাঁর ব্যবস্থাপক, কর্মচারী, পাচক কে খানায় নেওয়া হয়েছে। চায়নিজ রেস্টোরাঁ থেকে আগের দিন আনা খাবার গত কাল সোমবার দুপুরে গরম করে খেয়ে ঘুমিয়ে পড়েন সুরাত আমান (১২) ও আলভী আমান (৬)। এরপর তারা আর জেগে ওঠেনি। অচেতন অবস্থায় হাসপাতালে নেওয়া হলে চিকিৎসকেরা তাদের মৃত ঘোষণা করেন। পরিবারের অভিযোগের ভিত্তিতে পুলিশ জিজ্ঞাসাবাদের জন্য ওই রেস্টোরাঁর মালিক কে খানায় নিয়ে গেছে। সুরাতা ভিকারুন নিসানুন স্কুল অ্যান্ড কলেজের পঞ্চম ও আলভী হলিফ্রি সেন্ট স্কুলে নার্সারি শ্রেণির শিক্ষার্থী। তাদের বাবামো আমান উল্লাহ ব্যবসায়ী ও মাজেসমিন আক্তার গৃহিণী। এই দম্পতির এই দুটি সন্তানই ছিল। চায়নিজ রেস্টোরাঁ থেকে আগের দিন আনা খাবার গত কাল সোমবার দুপুরে গরম করে খেয়ে ঘুমিয়ে পড়েন সুরাত আমান (১২) ও আলভী আমান (৬)। এরপর তারা আর জেগে ওঠেনি। অচেতন অবস্থায় হাসপাতালে নেওয়া হলে চিকিৎসকেরা তাদের মৃত ঘোষণা করেন। পরিবারের অভিযোগের ভিত্তিতে পুলিশ জিজ্ঞাসাবাদের জন্য ওই রেস্টোরাঁর মালিক কে ওই দিনই খানায় নিয়ে গেছে।

Getting Summary of Sample

Title: দুই শিশুর লাশের ময়নাতদন্ত হয়েছে।

Text:রামপুরাখানারভারপ্রাপ্তকর্মকর্তা (ওসি) রফিকুলইসলামবলেন, এখনোমামলাহয়নি।

দুইভাইবোনেরময়নাতদন্তহয়েছে,মামলাহয়নিরাজধানীরবনশ্রীতেদুইভাইবোনেরহস্যজনকম্
তু্যরঘটনায়এখনোমামলাহয়নি।শিশুদেরবাবামামলাকরবেনবলেজানিয়েছেপরিবার।পরিবারেরপক্ষ
থেকেআজমামলাহতেপারে।শিশুদেরবাবাআমানউল্লাহরবন্ধুজাহিদুলইসলামআজমঙ্গলবারবেলাসো
য়া১১টারদিকেপ্রথমআলোকেএসবকথাজানায়।

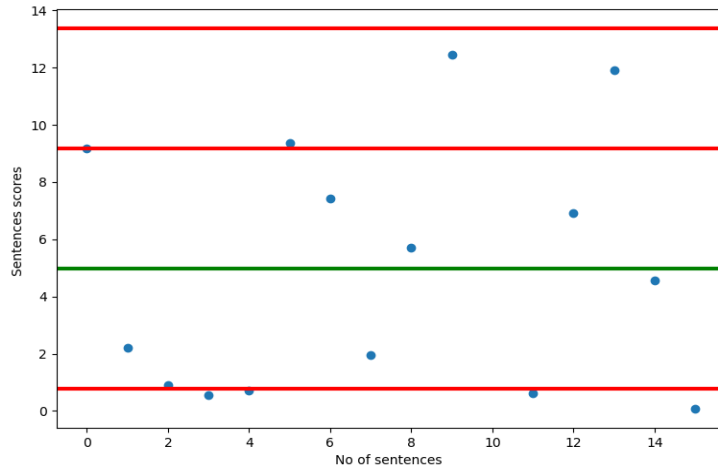


Figure 1.Sentence Scoring of Sample Document

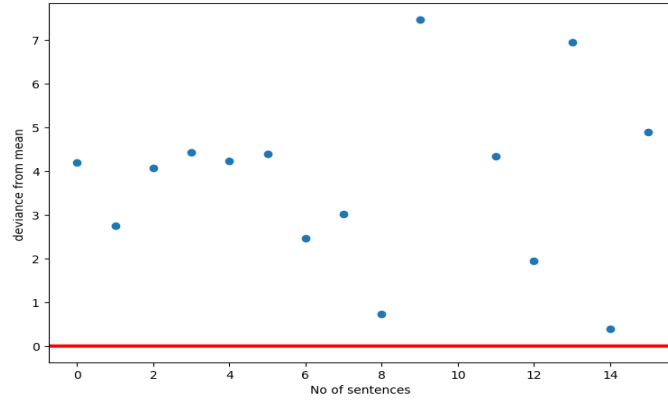


Figure 2.Mean Deviance of Sample Document

4.1 Co-selection measures

Co-selection measures: In co-selection measures, the principal evaluation metrics are [12]:

(i) Precision (P):

It is the number of sentences occurring in both system generated summary and ideal summary divided by the number of sentences in the system generated summary.

$$\text{Precision (P)} = (A \cap B) / A$$

Where 'A' denotes that the number of sentences obtained by the summarizer and also 'B' denotes the number of relevant sentences compared to target sets.

(ii) Recall (R):

It is the number of sentences occurring in both systems generated summary and ideal summary divided by the number of sentences in the ideal summary.

$$\text{Recall(R)} = (A \cap B) / B$$

Where 'A' denotes that the number of sentences obtained by the summarizer and also 'B' denotes the number of relevant sentences compared to target sets.

(iii) F-measure:

The integrated measure that incorporated both Precision and Recall is F-measure.

$$\text{F-Score} = (2 \times P \times R) / (P + R)$$

Where 'A' denotes that the number of sentences obtained by the summarizer and also 'B' denotes the number of relevant sentences compared to target sets.

The Evaluation result of first 10 document has given below in table 1.

Table 1. Result of Precision, Recall and F-score

Document No	Precision(P)	Recall(R)	F-Score
1	0.84	0.71	0.76
2	0.79	0.72	0.75
3	0.82	0.69	0.74
4	0.82	0.68	0.74
5	0.79	0.71	0.74
6	0.82	0.73	0.75
7	0.78	0.72	0.73
8	0.85	0.70	0.75
9	0.85	0.71	0.76
10	0.84	0.71	0.76
Average	0.82	0.70	0.74

5 Conclusion

We have gone for an Automatic Bengali Document Summarizer using Python as a programming platform. There is enough resources for English to process and obtain summarize documents. But this thing is not directly applicable for Bengali Language as there is lots of complexity in Bengali, which is not same to English in the context of Grammar and sentence structure. Again, doing this for Bengali is harder as there is no established tool to facilitate research work. But this necessary as 26 crore people use this language. So, we have gone for a new approach Bengali document summarization. Here, the system design has been completed by preprocessing the i/p (input) doc, tagging the word, replacing pronoun, sentence ranking respectively. Pronoun replacement has been added here to minimize the rate of swinging pronoun in the output summary. As the pronoun replacement we have gone ranking sentences according to sentence frequency, numerical figures (both in digit and word version), document title. Here if the sentence has any word that exists in title also taken into our account. The similarity between two sentences has been checked to deduct one as that cause's less redundancy. The numerical figure also makes an impact so they were also identified. We have taken over 3000 newspaper and books documents words has been trained according to grammar. And two documents has been checked by the design system to evaluate the efficiency of designed summarizer. From the evaluation system it is been found that the Recall, Precision, F-score is 0.70 as it is 70%, 0.82 as it is 82%, 0.74 as it is 74% respectively.

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