Approaches to personalized news extraction framework

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Abstract: Personalization is inevitable in the field of news domain. Due to the increased use of internet and increase in the number of news channels, the production of news is vast. The public find it difficult to get the latest updates on their interest from the large quantity of news produced. People rely on news stories which consist of related events than the exact news update. The Journalist finds it difficult to extract related news events to create news story from the news archives due to the huge volume of news and insufficient automated tools. We have conducted a study about the existing personalized news extraction approaches for this problem and this paper include its details

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I. INTRODUCTION

Mass media plays a vital role in communicating with a large audience. Nowadays the media are the fundamental part of our lives. Over the last decade, the amount of information available has grown exponentially. The pace of production is also increasing as more and more news organizations are come into existence and new types of news media hit the market. There are various sources of information and each one seems to produce much more potentially relevant information. As a result of globalization, news from remote parts of the world starts gaining importance, and this can affect some aspects of our lives. Newspapers, television and other media are spreading the news of every event around the world. The average person can read the newspapers and watch a news program on TV. However, it is not possible to know all events in the world. On the other hand, most information from the media resources may not be relevant to the end user. All this is of particular importance to professionals whose work is based on news analysis especially journalist. Computerized systems can help journalist in providing a quick and comprehensive analysis of available sources. The filtering by date and section (politics, economy, etc.) is not enough for today's requirements. There must be automatic work on the body of each news in different types of media to capture the semantics expressed in it. The customization provides a user with a unique view of the information when the information is customized to a user preference. The main benefit of customization is that each user focuses on the information that best suits them. By providing personalized information to a user, they can better handle this information than if they were displayed with the huge general news.

With the development of the Internet, huge information about current news events is continuously generated and disseminated on online news media sites. It is difficult for the public to effectively process such large amounts of information. The automated generation of news summary of certain related news events has recently been intensively studied [1]. The news storyline consists of related news events which are ordered and clustered according to their content and temporal similarities. There are different ways to calculate content and temporal similarities [2,3]. The Bayesian nonparametric models could also be used to solve this problem by describing the storyline generation process using probabilistic graphical models [4]. The existing approaches independently extract news events and link relevant events. The applications of Deep learning techniques are successful in various tasks dealing with natural languages. Therefore, it would be fascinating to merge the benefits of the probabilistic graphical modeling and deep neural networks in news storyline generation. In recent years, some attempts are taken to explore this [5].

This paper is structured as follows. The related works are described in section II. Section III summarizes the review we conducted and finally, in section IV the conclusions and future scope are explained.

II. RELATED WORKS

2.1 Traditional Approach to Personalization

Traditional approaches to customization include the approaches mainly the content-based and userbased [6]. Systems with recommendations are usually rated according to how recommendations are made [7]. A content-based or individual approach requires maintenance of an accurate user profile (eg, the user can provide the system with a sequence of keywords that reflect their original interests, and the profiles can be in the form of weighted and updated keyword vectors based on explicit feedback. However, in the case of areas such as news, a user's interest in an article is not always indicated by the present terms/topics in a document.

In addition to the approaches discussed above, several hybrid approaches have been proposed. These hybrid systems have been motivated by the observation that each of the recommendation technologies developed in the past has certain shortcomings that are difficult to overcome within the bounds of a single recommendation approach. For example, the inability of the approaches like collaborative filtering to recommend new articles can be resolved by linking them to a content-based recommendation approach. Not surprisingly, the most usual form of hybrid recommendation combines content-based and collaborative filtering. There are plenty of recommendation systems based on personalized news are available which follows the traditional approach [8,9,10,11,12,13,14,15,16].

2.2 Ontology-Based approach to Personalization

A traditional approach has one drawback: the difficulty of grasping the semantic knowledge of the area of application, i.e. Concepts, relationships between different concepts, inherent properties associated with concepts, axioms, or other rules, etc. The most crucial thing to learn from these customized news systems is that it is important to have a good understanding of the domain in which the news is available. Generic understanding does not give user-specific results. If there are multiple domains, then a content specific domain model will provide the best result. Domain models that have a good semantic structure will provide better news. The semantic approach to retrieve relevant information can be useful in determining the type or quality of information proposed for a personalized environment [17]. In this context, the standard keyword search has only a very limited effect. For example, it cannot filter the type of information, the level of information, underlying semantics of information or the quality of the information.

An Ontology-Based Information Extraction can be used to draw out the hidden semantics of the news content and can provide a personalized recommendation for the user query. In recent years a lot of ontology-driven news extraction frameworks are developed [18,19,20,21,22,23,24,25,26,27]

One of the major short comings of automatic summarization research is the vague semantic understanding of the source, which is reflected in the poor quality of the resulting abstracts. Using knowledge provided by ontologies to build a semantic representation of the text that is complex can alleviate the problem considerably. In this paper, an extraction method for summarization particularly, ontology-based is presented. It is based on the correlation of text to concepts and the presentation of the document and its sentences as graphics [28]

2.3 language processing tools based approach

Natural language generation (NLG) is known to be the science of "linguistic manipulating of data" [29]. There exist several techniques for NLG including rule-based, statistical and data-driven. Rule-based models rely on hand-written specialized rules for the generation. Rule-based models are also template-based where the models make use of predefined phrases or grammar. The problem with these is that they often require many rules to be crafted and the resulting model will often be restricted to a small specialized domain as well as a small vocabulary. This, in turn, means that the model may perform very well but it lacks flexibility [30]. Statistical models (usually some combination of N-gram models) are based on counts retrieved from the training data. The models allow for explicit modeling of the context and joint probabilities. The issue with these models arises because they are restricted to what they see and their assumption of independence. So these models can't capture any long-term dependencies.

Despite the increased quantity of data as well as the latest evolution of natural language generation techniques, the work in automated journalism is still relatively insufficient. In this article, the challenges associated with the building of a journalistic system of natural language generation are discussed. The architecture for automated journalism that is data-driven specific is proposed and that is independent in domain and language. The paper illustrates its real application in producing articles based on the request of the user in regard to the Finnish municipal elections of 2017 in three languages [31]

As the amount of information consumed daily increases, time to retrieve the information is also important. Staying up to date is an activity that is important to everyone, but also the time you save is important. This paper is primarily focused on implementing techniques that are based on natural language processing and algorithms to aggregate news articles from public sources so that they can be consumed in a short time to keep users informed of global and local events. The proposed solution uses the Text Rank algorithm [32].

Abstractive Summarization generates a shorter advanced version of a text document that is informative by using key Information from the text. This paper proposes an abstract technique and uses natural language processing. The Stanford's approach, as used in this paper, uses NLP instruments, rules of extraction etc. The results prove that the use of Natural Language Processing (NLP) in automatic text compression offer a certain level of abstraction level that is not possible with statistical approaches. The results suggest that based on the parameters Information content, the satisfaction of the reader, length of the summary and grammatical accuracy, proposed approach produces significant results [33].

Today, with the massive demand for sports news, automatic generation systems are being used to the quick and effective generation of massive sports news. In this paper, an automatic generation method based on knowledge rules for dynamically selecting the template from a template set is proposed. It is a data-to-text template-based system that generates summaries from structured input data. The text generated by the system is flexible [34]

2.4 Neural network based approach

Machine generated texts become more and more common over past years. Today there are varieties of methods and techniques are available for producing texts of various types and qualities. As computation power grew with time, the complexity of the models capturing the languages is also increased. Many of the successful models are based on deep learning and neural networks [35,36]

Recently, neural models are used for generating headlines. It was done by using the recurrent neural network which is a learning method that can map documents to the respective headlines. In this study, we include an introduction in detail and a comparison of existing and recent developments in neural headline generation is also explained [37].

The storyline generation aims to extract news events on news articles under a specific news category. Most of the existing approaches are first trained to extract news events that have been published in different periods. Then it will link relevant events into coherent stories. They are domain dependent. To solve this problem, Approaches based on probabilistic graphics models are also jointly used. In this paper, we propose an Extraction framework based on neural networks. The proposed model was assessed on three news corpora [38]

When the recurrent neural networks (RNN) are developed, different natural language generation (NLG) tasks are easily solved in recent years. The NLG fails to study the automated extraction and generation of comments in the news which is a challenging and a new approach. Different from other NLG tasks, this approach needs a contextual meaning. Also, we have to generate comments from varied opinions because for the same news different people across the may have various opinions from their perspective. In this paper, we suggest a Gated Attention Neural Network (GANN) model to in order to generate the comments in the news. We introduce the gated attention technique to self-adaptively and selectively use the context of news so as to tackle the issue of contextual relevance, To ensure the variety of comments, the suggested model uses random sampling and relevance controls to generate comments with different topics [39]

An important role of news sites is to recommend articles that are interesting to read. The key challenge of the news recommendation is to recommend newly published articles. This paper presents a session-based Recurrent Neural Network (RNN) model adapted to the news recommendation. The suggested model uses ConvolutionalNeural Network (CNN) to capture user preferences and adjust referral results [40].

Extractive text allows a set of sentences contained in the real document to be selected and summarized so that the user can better search and grasp the document content. The latest field of research in Extractive summarization uses language modeling (LM) approach. However, the biggest challenge to LM's approach is the way to define sentence representations and accurately determine their parameters. In light of this, this paper examines a new application of the popular Recurrent Neural Network Language Modeling (RNNLM) framework for the extractive summary of news [41].

III. REVIEW SUMMARY

Various approaches to personalized news extraction systems were studied. Table 1 outlines the News extraction systems reviewed in this paper. We have discussed 4 different approaches. Traditional approach fails to capture the underlying semantics of news content. Thus it does not provide a personalized extraction result. Ontology-based systems provide semantically similar news contents as per the user need but do not have a capability of summarizing or generating news from related news stories.NLP tools based systems have limitations in flexibility, the number of rules required, size of domain etc. Neural network based frameworks give a plenty of options and it is yet to be explored. Table 1 recapitulates the systems in the domain of the personalized news extraction framework

| Personalized Extraction | Reviewed works | year |
|-------------------------|---|------|
| Approach | | |
| | Personal news agent[8] | 1999 |
| | Bikini[10] | 2001 |
| Traditional Approach | Merialdo et al. [11]. | 1999 |
| | Billsus et al. [12] | 2000 |
| (Content Based + | PIN [13] | 1998 |
| Collaborative + | PTV [14] | 2000 |
| Hybrid) | | |
| | Google News[9] | 2007 |
| | | |
| | UseNet News [15] | 1997 |
| | | |
| | | 2010 |
| | New Google News recommendation system[16] | |
| | SmartPush [18] | 2001 |
| | | 2001 |
| Somentic Resod | Sean [19] | 2001 |
| Semantic Based | acaMadia personalization system[21] | 2005 |
| (Ontology based) | myPlonet[20] | 2003 |
| | Inyr fanet[20] | 2001 |
| | SenSee[23] | 2007 |
| | Valet et al.[22] | 2006 |
| | Hermes framework [26] | 2007 |
| | Athena[27] | 2010 |
| | ePaper[24] | 2009 |
| | News@hand[25] | 2008 |
| | ontology-based extractive method for summarization | 2010 |
| NLP tools based | data-driven architecture [31] | 2017 |
| | | 2016 |
| | TextRank algorithm[32] | |
| | Abstractive Summarization [33] | 2017 |
| | sports news, automatic generation systems [34] | 2017 |
| Neural Network Based | | 2018 |
| | News storyline generation [38] | |
| | News comments generation [39] | 2018 |
| | Session based news recommendation [40] | 2017 |
| | RNNLM framework [41] | 2015 |

Table no 1: Summary of systems in the domain of the personalized news extraction framework

IV. CONCLUSION

In this paper, we have analyzed and reviewed different approaches to personalized news extraction frameworks. In recent years extensive investigations and analysis have been done in the domain of personalized media extraction. Since neural network based media extraction is a new field with a lot of potentials, it can be expected to grow in different directions. Due to the huge amount of news items produced daily, the public is looking forward to news stories based on related news events which give updates on a particular news topic. Journalist requires an automated tool which can be used in an archival system to extract a news story as per

his/her preference. The use of a neural network in this area is promising and further studies should take place to explore the power of neural networks.

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