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### ASSAMESE-ENGLISH BILINGUAL MACHINE TRANSLATION

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### **ABSTRACT**

Machine translation is the process of translating text from one language to another. In this paper, Statistical Machine Translation is done on Assamese and English language by taking their respective parallel corpus. A statistical phrase based translation toolkit Moses is used here. To develop the language model and to align the words we used two another tools IRSTLM, GIZA respectively. BLEU score is used to check our translation system performance, how good it is. A difference in BLEU scores is obtained while translating sentences from Assamese to English and vice-versa. Since Indian languages are morphologically very rich hence translation is relatively harder from English to Assamese resulting in a low BLEU score. A statistical transliteration system is also introduced with our translation system to deal basically with proper nouns, OOV (out of vocabulary) words which are not present in our corpus.

### **KEYWORDS**

Assamese, Machine translation, Moses, Corpus, BLEU

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### NAMED ENTITY RECOGNITION USING HIDDEN MARKOV MODEL (HMM)

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### **ABSTRACT**

Named Entity Recognition (NER) is the subtask of Natural Language Processing (NLP) which is the branch of artificial intelligence. It has many applications mainly in machine translation, text to speech synthesis, natural language understanding, Information Extraction, Information retrieval, question answering etc. The aim of NER is to classify words into some predefined categories like location name, person name, organization name, date, time etc. In this paper we describe the Hidden Markov Model (HMM) based approach of machine learning in detail to identify the named entities. The main idea behind the use of HMM model for building NER system is that it is language independent and we can apply this system for any language domain. In our NER system the states are not fixed means it is of dynamic in nature one can use it according to their interest. The corpus used by our NER system is also not domain specific.

### **KEYWORDS**

Named Entity Recognition (NER), Natural Language processing (NLP), Hidden Markov Model (HMM).

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### GRAMMAR CHECKERS FOR NATURAL LANGUAGES: A REVIEW

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### **ABSTRACT**

Natural Language processing is an interdisciplinary branch of linguistic and computer science studied under the Artificial Intelligence (AI) that gave birth to an allied area called 'Computational Linguistics' which focuses on processing of natural languages on computational devices. A natural language consists of many sentences which are meaningful linguistic units involving one or more words linked together in accordance with a set of predefined rules called 'grammar'. Grammar checking is fundamental task in the formal world that validates sentences syntactically as well as semantically. Grammar Checker tool is a prominent tool within language engineering. Our review draws on the till date development of various Natural Language grammar checkers to look at past, present and the future in the present context. Our review covers common grammatical errors, overview of grammar checking process, grammar checkers of various languages with the aim of seeking their approaches, methodologies and performance evaluation, which would be great help for developing new tool and system as a whole. The survey concludes with the discussion of different features included in existing grammar checkers of foreign languages as well as a few Indian Languages.

### **KEYWORDS**

Natural Language Processing, Computational Linguistics, Writing errors, Grammatical mistakes, Grammar Checker

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# RESUME INFORMATION EXTRACTION WITH A NOVEL TEXT BLOCK SEGMENTATION ALGORITHM

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### **ABSTRACT**

In recent years, we have witnessed the rapid development of deep neural networks and distributed representations in natural language processing. However, the applications of neural networks in resume parsing lack systematic investigation. In this study, we proposed an end-to-end pipeline for resume parsing based on neural networks-based classifiers and distributed embeddings. This pipeline leverages the position-wise line information and integrated meanings of each text block. The coordinated line classification by both line type classifier and line label classifier effectively segment a resume into predefined text blocks. Our proposed pipeline joints the text block segmentation with the identification of resume facts in which various sequence labelling classifiers perform named entity recognition within labelled text blocks. Comparative evaluation of four sequence labelling classifiers confirmed BLSTMCNNs-CRF's superiority in named entity recognition task. Further comparison among three publicized resume parsers also determined the effectiveness of our text block classification method.

### **KEYWORDS**

Resume Parsing, Word Embeddings, Named Entity Recognition, Text Classifier, Neural Networks.

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### SURVEY OF MACHINE TRANSLATION SYSTEMS IN INDIA

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### **ABSTRACT**

The work in the area of machine translation has been going on for last few decades but the promising translation work began in the early 1990s due to advanced research in Artificial Intelligence and Computational Linguistics. India is a multilingual and multicultural country with over 1.25 billion population and 22 constitutionally recognized languages which are written in 12 different scripts. This necessitates the automated machine translation system for English to Indian languages and among Indian languages so as to exchange the information amongst people in their local language. Many usable machine translation systems have been developed and are under development in India and around the world. The paper focuses on different approaches used in the development of Machine Translation Systems and also briefly described some of the Machine Translation Systems along with their features, domains and limitations.

### **KEYWORDS**

Machine Translation, Example-based MT, Transfer-based MT, Interlingua-based MT

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# SURVEY ON MACHINE TRANSLITERATION AND MACHINE LEARNING MODELS

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### **ABSTRACT**

Globalization and growth of Internet users truly demands for almost all internet based applications to support local languages. Support of local languages can be given in all internet based applications by means of Machine Transliteration and Machine Translation. This paper provides the thorough survey on machine transliteration models and machine learning approaches used for machine transliteration over the period of more than two decades for internationally used languages as well as Indian languages. Survey shows that linguistic approach provides better results for the closely related languages and probability based statistical approaches are good when one of the languages is phonetic and other is nonphonetic. Better accuracy can be achieved only by using Hybrid and Combined models.

### **KEYWORDS**

CRF, Grapheme, HMM, Machine Transliteration, Machine Learning, NCM, Phoneme, SVM

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MACHINE TRANSLATION DEVELOPMENT FOR INDIAN LANGUAGES AND ITS APPROACHES

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### **ABSTRACT**

This paper presents a survey of Machine translation system for Indian Regional languages. Machine translation is one of the central areas of Natural language processing (NLP). Machine translation (henceforth referred as MT) is important for breaking the language barrier and facilitating interlingual communication. For a multilingual country like INDIA which is largest democratic country in whole world, there is a big requirement of automatic machine translation system. With the advent of Information Technology many documents and web pages are coming up in a local language so there is a large need of good MT systems to address all these issues in order to establish a proper communication between states and union governments to exchange information amongst the people of different states. This paper focuses on different Machine translation projects done in India along with their features and domain.

### **KEYWORDS**

Machine translation, computational linguistics, Indian Languages, Rule-based, Statistical, Empirical MT, Principle-based, Knowledge-based, Hybrid

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ALGORITHM FOR TEXT TO GRAPH CONVERSION AND SUMMARIZING USING NLP: A NEW APPROACH FOR BUSINESS SOLUTIONS

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**ABSTRACT** 

Text can be analysed by splitting the text and extracting the keywords . These may be represented as summaries, tabular representation, graphical forms, and images. In order to provide a solution to large amount of information present in textual format led to a research of extracting the text and transforming the unstructured form to a structured format. The paper presents the importance of Natural Language Processing (NLP) and its two interesting applications in Python Language: 1. Automatic text summarization [Domain: Newspaper Articles] 2. Text to Graph Conversion [Domain: Stock news]. The main challenge in NLP is natural language understanding i.e. deriving meaning from human or natural language input which is done using regular expressions, artificial intelligence and database concepts. Automatic Summarization tool converts the newspaper articles into summary on the basis of frequency of words in the text. Text to Graph Converter takes in the input as stock article, tokenize them on various index (points and percent) and time and then tokens are mapped to graph. This paper proposes a business solution for users for effective time management.

### **KEYWORDS**

NLP, Automatic Summarizer, Text to Graph Converter, Data Visualization, Regular Expression, Artificial Intelligence

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# NERHMM: A TOOL FOR NAMED ENTITY RECOGNITION BASED ON HIDDEN MARKOV MODEL

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Named Entity Recognition (NER) is considered as one of the key task in the field of Information Retrieval. NER is the method of recognizing Named Entities (NEs) in a corpus and then organizing these NEs into diverse classes of NEs e.g. Name of Location, Person, Organization, Quantity, Time, Percentage etc. Today, there is a great need to develop a tool for NER, since the existing tools are of limited scope. In this paper, we would discuss the functionality and features of our tool of NER with some experimental results.

### **KEYWORDS**

HMM, NER, F-Measure, Accuracy, NEs

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### MACHINE LEARNING ALGORITHMS FOR MYANMAR NEWS CLASSIFICATION

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### **ABSTRACT**

Text classification is a very important research area in machine learning. Artificial Intelligence is

reshaping text classification techniques to better acquire knowledge. In spite of the growth and spread of AI in text mining research for various languages such as English, Japanese, Chinese, etc., its role with respect to Myanmar text is not well understood yet. The aim of this paper is comparative study of machine learning algorithms such as Naïve Bayes (NB), k-nearest neighbours (KNN), support vector machine (SVM) algorithms for Myanmar Language News classification. There is no comparative study of machine learning algorithms in Myanmar News. The news is classified into one of four categories (political, Business, Entertainment and Sport). Dataset is collected from 12,000 documents belongs to 4 categories. Well-known algorithms are applied on collected Myanmar language News dataset from websites. The goal of text classification is to classify documents into a certain number of pre-defined categories. News corpus is used for training and testing purpose of the classifier. Feature selection method, chi square algorithm achieves comparable performance across a number of classifiers. In this paper, the experimental results also show support vector machine is better accuracy to other classification algorithms employed in this research. Due to Myanmar Language is complex, it is more important to study and understand the nature of data before proceeding into mining.

### **KEYWORDS**

Text Classification, Machine Learning, Feature Extraction

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