Machine Translation Development for Indian Languages and its Approaches

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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 inter-lingual 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

1.INTRODUCTION

Machine translation is one of the central areas of Natural language processing (NLP). Machine translation (MT) is important for breaking the language barrier among the people and for interlingual communication where translation is done from source language to target language. Many researchers, Institutions and organizations in India have started working on MT systems for Indian languages and have gained satisfactory results. The research scenario in India is relatively young and MT gained momentum in India with institutions like IIT Kanpur, IIT Mumbai, IIIT Hyderabad, University of Hyderabad and CDAC Pune play a major role in developing these systems.

This paper is organized into 4 sections. Section2 gives an introduction of MT & different approaches to build MT systems, Section 3 discuss major MT systems in India based on language with their features, domain etc. and finally we conclude the paper in the next section.

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2.MACHINE TRANSLATION

Like translation done by human, MT does not simply substituting words but the application of complex linguistic knowledge; morphology, grammar, meaning all this things is taken into consideration. Generally, MT is classified into various categories: Direct based, rule-based, corpus based, statistical-based, hybrid-based, example-based, knowledge-based, principle-based, and online interactive based methods. At present, most of the MT related research is based on Rule based approaches because rule based is always extensible and maintainable.

1.Direct Translation

Direct Machine Translation is the one of the simplest machine translation approach in which a direct word to word translation is done with the help of a bilingual dictionary.

2. Rule Based Translation

A Rule-Based Machine Translation (RBMT) system consists of collection of various rules, called grammar rules, a bilingual lexicon or dictionary, and software programs to process the rules.

3.Interlingua Based Translation

In this approach, the translation consists of two stages, where the source Language (SL) is first converted in to the Interlingua (IL) form. The main advantage of Interlingua approach is that the analyzer and parser of SL is independent of the generator for the Target Language (TL) and this requires complete resolution of ambiguity in source language text.

4.Statistical-based Approach

Statistical machine translation (SMT) is a data-oriented statistical framework which is based on the knowledge and statistical models which are extracted from bilingual corpora. In this MT, bilingual or multilingual corpora of the languages are required. In SMT, a document is translated according to the probability distribution function which is indicated by p(e/f). Finding the best translation is done by picking the highest probability, as shown in Equation 1.

$$e = argmax p (e | f) = argmax p (f | e) p(e) \dots (i)$$

5.Example-based translation

Basic idea of this MT is to reuse the examples of already existing translations. An example-based translation is uses a bilingual corpus as its main knowledge base and it is essentially translation by analogy.

6.Knowledge-Based MT

Knowledge-Based Machine Translation (KBMT) requires complete understanding of the source text prior to the translation into the target text. KBMT is implemented on the Interlingua

architecture. KBMT must be supported by world knowledge and by linguistic semantic knowledge about meanings of words and their combinations.

7.Principle-Based MT

Principle-Based Machine Translation (PBMT) Systems are based on the Principles & Parameters Theory of Chomsky's Generative Grammar and which employs parsing method. In this, the parser generates a detailed syntactic structure which contains lexical, phrasal, grammatical information.

8.Online Interactive Systems

In this online interactive translation system, the user has authority to give suggestion for the correct translation. This approach is very useful, where the context of a word is not that much clear or unambiguous and where multiple possible meanings for a particular word.

9.Hybrid-based Translation

By taking the advantage of statistical MT and rule-based MT methodologies, a new approach was developed, which is termed as "hybrid-based approach". The hybrid approach used in a number of different ways. Translations are performed in the first stage using a rule-based approach which is followed by adjusting or correcting the output using statistical information. Second way in which rules are used to pre-process the input data and for post-process the statistical output of a statistical-based translation system.

3.LITERATURE SURVEY

In this section we now look at some major English-Indian language MT project. The parameters we look at are: language pair(s), approaches used for handling problems, year of publication & application domain of each MT system. The scope of this paper is restricted to Hindi, Punjabi, Bengali, English and Marathi languages as source/target language.

A.Translation system	for Hindi language as a S	Source or Target language
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SR No	Machine Translation Systems	Year	Languages for translation	Domain / Application	Approach used	Observations
1.	ANUSAARAK MT [1][47]	1995	IL-IL	For translating children's stories	Direct based	The focus is on language access between Indian languages. Works on the principles of Paninian Grammar (PG).

2.	MANTRA MT [2]	1997	English- Hindi	General	Transfer based	It uses TAG & XTAG. Uses tagger and light dependency analyzer for performing the analysis of I/P English text. It distributes a load on man and
3.	MANTRA RAJYASABHA [2][48]	1999	English- Hindi	Office administration documents	Transfer based	machine in equal way. System uses TAG & LTAG to represent a grammar. Can preserve the formatting of input word document. Currently working on Hindi to English and Hindi-Bengali.
4.	ANUBHARTI-I [2]	2003	Hindi- English	General	Hybrid	Combination of example based, corpus based & some grammatical analysis. It reduces the requirement of large example base and it depends on target language.
5.	ANUBHARTI-II [2]	2004	Hindi- English	General	Hybrid	It emulates human-learning process for storing knowledge from past experience to use it in future. Shallow chunker is used for fragmentation of input sentences.
6.	Hinglish MT System [49]	2004	Hindi- English	General	Example based	Based on Anubharti-II &Anglabharti-II. It produces satisfactory results in more than 90 cases. It performs shallow grammatical analysis.
7.	An English–Hindi Translation System	2002	English- Hindi	Weather narration	Transfer based	Translation modules consist

	[2]					of
	[3]					of preprocessing and post processing of English tree. Also include generation of Hindi tree.
8.	UNL-based English-Hindi MT System [50]	2001	English- Hindi	General	Interlingua	Based on UNL grammar. Easy to add new language for translation.
9.	MaTra: A Practical Approach to Fully- Automatic Indicative English- Hindi Machine Translation [4][51]	2004- 2006	English- Hindi	News, annual report, technical phrases	Transfer based	Based on MSIR. It uses transfer frame like structure representation & also uses heuristics to resolved ambiguities.
10.	GB Theory Based Hindi To English Translation System [5]	2009	Hindi- English	General	Example Based	System makes use of Government and Binding (GB) theory for undertaking translation. It consists of a parsing module and generating module.
10.	A Pure EBMT Approach for English to Hindi Sentence Translation System [6]	2014	English- Hindi	comparing sentence to extract the translation	Example based	This system uses parallel corpora for translation. It contains various modules such as similarity matrix, training matrix & tagging matrix.
11.	Interlingua based English-Hindi Machine Translation system and Language Divergence [7]	-	English- Hindi	General	Interlingua and Transfer based	Here UNL represents information sentence by sentence. Lexical- semantic divergence is handled in L-UW dictionary. Syntactic divergence is primarily tackled by analyzers. The amenability to generation is tested through Marathi Language.

SR No	Machine Translation	Year	Languages for	Domain / Application	Approach used	Observations
1.	English to Devnagari Translation for UI Labels of Commercial web based Interactive Applications [8]	2011	English- Devnagari	Web based Applications	Hybrid	Used banking glossary available on the web site of RBI to create multilingual dictionary. For lexical analyzer rules are written by C languages. Used Bison tools for running system.
2.	Extending capabilities of English to Marathi Machine Translator [9]	2012	English- Marathi	General	Rule-based	Much functionality can be added for improving the performance of translation. It can be expanded by including spelling and grammatical checks, sentiment analysis modules.
3.	Rule based English to Marathi translation of Assertive sentence [10]	2013	English- Marathi	General	Rule-based	Database of set of rules maintained for mapping. Bilingual-Dictionary database plays very important role which is endless. Open-nlp tools performing different processes.
4.	A novel approach for Interlingual example-based translation of English to Marathi [11]	2014	English- Marathi	General	Hybrid	System is trained from bilingual parallel corpora. Sentence pairs contain sentence in one language with their translation into another. Uses parsing techniques.
5.	Transmuter: An approach to rule based English-Marathi machine Translation [12]	2014	English- Marathi	General	Rule-based	The focus is on grammar structure of target language that produces better & smoother translation. Lexicon is built for morphological & semantic properties.

C.Translation system for Sanskrit language as a Source or Target language

SR No	Machine Translation Systems	Year	Languages for translation	Domain / Application	Approach used	Observations
1.	ANN & Rule based model for English to Sanskrit Translation (EST) [13]	2010	English- Sanskrit	General	Rule based	The system makes use of feed forward ANN to make selection of Sanskrit words and adjectives from English to Sanskrit User Data Vector (UDV). This system employs only morphological markings to identify Subject, Object, Verb, Preposition etc.
2.	English To Sanskrit Machine Translator (Lexical parser & Semantic Mapper) [14]	2010	English- Sanskrit	General	Rule based	This system consists of 4 main modules: Lexical parser, Semantic Mapper, Translator & Composer. In this system the information can be obtained through introspection and analysis.
3.	Etrans- A complete Framework for English To Sanskrit Machine Translation [15]	2012	English- Sanskrit	General	Rule based	The translation model is primarily based on formulation of Synchronous Context Free Grammar (SCFG), a sub set of Context Free Grammar (CFG). Top-Down parsing algorithm is used for generating possibilities list.
4.	English to Sanskrit Translator and synthesizer [16]	2012	English- Sanskrit	General	Rule based	In the proposed algorithm system integrate traditional dictionary rule based approach for translation. It contains 2 models Text to Text Translator and Text to speech synthesizer module.
5.	English-to-Sanskrit Machine translation	2012	English- Sanskrit	General	Statistical based	Described the of a ubiquitous

	with ubiquitous					translation and
	applications [17]					language learning
	**					framework, on Mini
						2440 SBC, a
						growing cellular
						phone operating
						system with
						internet
						capabilities.
						Translation task is
						done by statistical
						machine decoder.
6.	TranSish [18]	2014	Sanskrit-	General	Rule-based	With the help of
			English			Artificial
						Intelligence system
						provide an interface
						which converts
						Sanskrit sentences
						to English with a
						rule based model of
						parser and a
						semantic Mapper.

D.Translation system for Bengali language as a Source or Target language

SR No	Machine Translation Systems	Year	Languages for translation	Domain / Application	Approach used	Observations
1.	ANUBAAD [19]	2000- 2004	English- Bengali	News headlines	Example based	If the headline is found in Generalized Tagged Example-base after synthesis then Bengali headline is generated. If the headline cannot be translated using Example-base, then Generalized Tagged example-base or Phrasal example-base is going to be used then after the heuristic translation strategy is used.
2.	VAASAANUBAADA [20]	2002	Bengali- Assamese	News text	Example based	Bilingual corpus is constructed and aligned manually. Longer sentences are fragmented at punctuation to obtain better quality translation.

3.	Exploiting Alignment Techniques in MATREX: the DCU Machine Translation System [21]	2008	English- Bengali	Conference papers	Example based	Makes use of marker-based chunking, psycholinguistic constraint which signifies context. System uses an "edit distance style" dynamic programming alignment algorithm for alignment purpose.
4.	A hybrid approach for Bengali to Hindi MT System [22]	2009	Bengali- Hindi	General	Hybrid	Multi-engine Machine Translation approach which Uses an integration of SMT with a lexical transfer based system (RBMT). The BLEU scores of SMT and lexical transfer based system are 0.1745 and .0424 respectively. The BLEU score of hybrid system is better which is 0.2275
5.	Lattice Based Lexical Transfer in Bengali Hindi MT Framework [23]	2011	Bengali- Hindi	General	Hybrid	Lattice based combined with transfer based Uses a lattice-based data structure which is a weighted directed acyclic graph.
6.	English To Bengali Machine Translation Using Context Free Grammars [24]	2013	English- Bengali	General	Rule based	Proposed system uses sentence construction rules in the form of CGF grammars. English-Bengali dictionary has been designed which support efficient translation.

E.Translation system for Punjabi language as a Source or Target language

SR No	Machine Translation Systems	Year	Languages for translation	Domain / Application	Approach used	Observations
1.	A Web Based English to Punjabi MT System for News Headlines [25]	2013	English- Punjabi	News Headline	Hybrid approach	Using Rule Based Approach, system parses the source text and produces an intermediate representation. The accuracy of the system is near about 81.67%.
2.	Statistical Machine Translation Based Punjabi to English Transliteration systems for proper noun [26]	2013	Punjabi- English	Government documents	Statistical based	The proposed system is divided to two parts – learning and transliteration. System Accuracy is depends on data stored into the database and overall accuracy of the system is measured upto 97%.
3.	Rule Based Machine Translation of Noun Phrases from Punjabi to English [27]	2010	Punjabi- English	To convert a noun phrase	Transfer	The system has analysis, translation and synthesis component. A Punjabi morph analyzer is being used for analyzing the exact grammatical structure of the word. Overall accuracy of translation is 85.33%.
4.	Web Based Hindi to Punjabi Machine Translation System [28]	2010	Hindi- Punjabi	News paper	Direct based	The present system is translating any complex sentence. The System accuracy is 95%.
5.	Hindi To Punjabi Machine Translation System [29]	2011	Hindi- Punjabi	General	Hybrid approach	Morphological analyzer developed by IIT-H has been ported which finds the root word for the token and its morphological features. The accuracy percentage for the system is 87.60%.

F.Translation system for Urdu language as a Source or Target language

SR	Machine	Year	Languages	Domain /	Approach used	Observations
No	Translation Systems		for translation	Application		
1.	Rule Based English to Urdu Machine Translation [30]	1	English-Urdu	Handle case phrases and verb post position	Transfer Approach	It describes the usage of Paninian theory in Urdu translation, which can handle case phrases and verb post position very efficiently. Moreover, this framework can also be used for other constructs and and handle conditional and comparative sentences by designing their TAM.
2.	Model for English- Urdu Statistical Machine Translation [31]	2013	English-Urdu	General	Statistical Approach	The model is trained on TrainSet using Moses with language modeling toolkit IRSTLM. TestSet gives the BLEU score of 32.11.
3.	Urdu to English Machine Translation using Bilingual Evaluation Understudy [32]	2013	Urdu-English	General	Corpus based	Explained methodology of each system and found their comparison based on their respective outputs using BLEU. The EBMT approach produced accuracy of 84.21% whereas the accuracy of the online SMT system is 62.68%.
4.	Developing English- Urdu Machine Translation Via Hindi [33]		English-Urdu	General	Interlingua based Rule- based approach	The English-Hindi lexical database is used for collecting all possible Hindi words and also phrases. Paradigm file is used for generating different morphological forms from the root and entered

		1	ī	ı	1	
5.	English to Urdu Hierarchical Phrase	2013	English-Urdu	General	Hierarchical Phrase based	based on correspondence with the tags associated with Hindi word. These are then manually validated. Uses EMILLE corpus. Language
	based statistical MT [34]					model is built on monolingual Urdu corpus and it is implemented as N-Gram model using SRILM toolkit.
6.	VERB TRANSFER FOR ENGLISH TO URDU MACHINE TRANSLATION (THESIS) [35]	2006	English-Urdu	Verb Transfer	Rule-based	Uses LFG for the analysis and generation modules of machine translation systems. Different senses and sub categorization frames were analyzed. Ditransitive Conversion rules are described to handle mismatch of ditransitive verb analysis in English and Urdu.
7.	Translation rules and ANN based model for English to Urdu Machine Translation [36]	2011	English-Urdu	General	ANN & Rule based	System uses feed- forward back- propagation artificial neural network for the selection of Urdu words/tokens and translation rules for grammar structure equivalent to English words/tokens and grammar structure rules. The n-gram blue score achieved is 0.6954; METEOR score achieved is 0.8583 and F-
8.	Hindi to Urdu Machine Translation		Hindi- Urdu	General	Character-based transliteration	score of 0.8650. Novel approach proposes two

	Through Transliteration [37]				model with a word-based translation model.	probabilistic models, based on conditional and joint probability. Use transliteration for disambiguation of Hindi homonyms which can be translated or transliterated or transliterated based on different contexts.
9.	Development of Parallel Corpus and English to Urdu Statistical Machine Translation [38]	2010	English-Urdu	General	Statistical approach	The whole corpus was divided into partitions for the purpose of cross-validation. The alignment of phrases is computed based on word-to-word alignment. Then after these translated phrases are sequenced using n-gram language model.

G.Translation system for Malayalam language as a Source or Target language

SR No	Machine Translation Systems	Year	Languages for translation	Domain / Application	Approach used	Observations
1.	English to Malayalam Translation [39]	2008	English- Malayalam	General	Statistical Approach	Monolingual corpus of Malayalam is used and bilingual is used for English language. The structural difference between English Malayalam pair is resolved applying order conversion rules.
2.	A Hybrid approach to English to Malayalam Machine Translation [40]	2013	English- Malayalam	General	Hybrid Approach	A statistical machine translator performs translation by applying machine learning techniques on the corpus.
3	Design & Development of a Malayalam To English Translator	2012	Malayalam- English	General	Transfer Approach	The system consists of a pre-processor for splitting the compound words, a

	[41]					morphological
						parser for context
						disambiguation and
						a bilingual
						dictionary. The
						system is designed
						using artificial
						intelligence
						techniques and can
						easily be modified
						to build translation
						systems for other
						language pairs.
4.	Malayalam to	2014	Malayalam-	General	Example	Consist of 3 phases:
	English Machine		English		based	Acquisition,
	Translation [42]					Matching &
						Recombination.
						The system
						searches in the
						corpus for each
						Malayalam
						fragments. About
						75% of the test
						gives good quality
						translation.

H.Translation system for Kannada language as a Source or Target language

SR No	Machine Translation Systems		Languages for translation	Domain / Application	Approach used	Observations
1.	MAT [43]	2002	English- Kannada	Government Circulars	Transfer based	Based on UCSG. 40-60% fully accuracy. Post editing tool is provided which outputs the number, type & interrelationships amongst various clauses in sentences. For each word suitable target equivalence is obtained from bilingual dictionary.
2.	A Typical Machin Translation System for English-Kannada [44]		English- Kannada	General	Rule based	In this system, Syntax reordering module does syntactic differences. Morphological generator which

			handle	the
			complex	
			morphology	y of
				arget
			language.	

I.Machine Translation for English to Indian language

SR No	Machine Translation Systems	Year	Languages for translation	Domain / Application	Approach used	Observations
1.	ANGLABHARTI-I [2]	2001	English-IL	Public health	Interlingua	Creates a PLIL intermediate structure. The effort of PLIL is 70% and text generation is 30%. Only with 30% new system can be built. In this 90% translation work is done by machine & 10% left to the human post-editing.
2.	ANGLABHARTI-II [2]	2004	English-IL	General	Example based	Provides provisions for automated pre- editing & paraphrasing, conditional multiword expressions as well as recognition of named-entities. Contains module for an error analysis, statistical language module.
3.	Shakti [52][53]	2003	English-IL	General	Transfer based	Linguistic rule based with statistical processing. Consist of various modules for analyzing the source languages, performing the bilingual task and generating target Indian language.
4.	Shiva and Shakti MT System [52][53]	2003	IL-IL	General	Example based	Easy to extend this system for new target

		T	1	1	1	
						language. Rules uses are mostly linguistic in nature. Semantic information is also used by some module.
5.	AnglaHindi [45]	2003	English-Hindi	General	Interlingua	Pseudo interlingua based. Uses all modules of Anglabharti. Use an abstracted example base. Accuracy is 90%.
6.	"English to Indian Languages MT System (E-ILMT)" [46]	2006	English-IL	Tourism and healthcare	Statistical based	The engine was developed using statistical techniques and tools such as fnTBL, Bikel, Pharaoh. Preprocessing phase does the syntactic re-ordering on the source language to reduce long distance movements. The corpus was morphologically processed and used for training to tackle the problem of degradation. A rule based suffix separation approach was used for separating the root word and the affixes.
7.	Google Translator [54]	2007	IL-IL	Geneal	Statistical based	Google Translate is a multilingual service supports 91 languages. The system depends on a solid corpus. The accuracy of translation is better to understand the translated text.
8.	ANUVAADAK by IIT-B [55]		IL-IL	General	Statistical Based	The system enables translation

						between 11 different Indian languages (including English), and provides transliteration support for Indic script input. Users can post-edit the translated text which provides feedback for improvement of the translation
9.	Sampark by IIT-H [56]	2009	IL-IL	General	Hybrid approach	Systems Sampark is a hybrid system which is combination of traditional rulesbased algorithms and dictionaries and various statistical machine-learning techniques.

4. CONCLUSION

The present paper discusses the various language translation systems developed in the India which follows different approaches. The systems are developed for various languages which include various language pairs such as English-Hindi, English-Marathi, English-Sanskrit, English-Malayalam, Malayalam-English, Bengali-Hindi, Bengali-Aasamese, English-Punjabi, Hindi-Punjabi, Punjabi-English/Hindi, English-Kannada, English-Urdu, Urdu-English and IL-IL.

It is concluded that direct approach for Machine Translation is most suitable for closely related languages i.e. the languages with similar structure. The indirect and statistical approach is suitable for languages with different structures.

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