

# **Example Based English-Bengali Machine Translation Using WordNet**

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### **Abstract**

In this paper we propose an architecture of English-Bengali Example Based Machine Translation (EBMT) using WordNet. The proposed EBMT system has five steps: 1) Tagging 2) Parsing 3) Prepare the chunks of the sentence using sub-sentential EBMT 4) Using an efficient adapting scheme, match the sentence rule 5) Translate from Source Language (English) to Target Language (Bengali) in the chunk and generate with morphological analysis with the help of WordNet. Using the word senses given by the WordNet we can detect the ambiguity and improve the correctness of translation.

### 1. Introduction

In present there are many ways of machine translation system. [2] Many researchers came up with different approaches. But still it is not possible to get the finest possible result. It has been found that EBMT has several

advantages in comparison with other MT paradigms. For example, it can be upgraded easily by adding more examples to the knowledge base. It is robust because of bestmatch reasoning. WordNet needed for word sense disambiguation. It makes explicit the semantic relations. Using WordNet we showed a way to improve English-Bengali EBMT.

### 2. Background

Example-based Machine Translation makes use of past translation examples to generate the translation of a given input. An EBMT system stores in its example base of translation examples between two languages, the source language and the target language.

These examples are subsequently used as guidance for future translation tasks. In order to translate a new input sentence in Source Language (SL), similar SL sentence is retrieved from the example base, along with its translation in Target Language (TL). This example is then adapted suitably to generate a translation of the given input.

It may be observed that in today's world a lot of information is being generated. However, since most of this information is in English, it remains out of reach of people at large for which English is not the language of communication. As a consequence, an increasing demand for developing machine translation systems from English to Bengali is being felt very strongly.

However, development of MT systems typically demands availability of a large volume of computational resources, which is currently not available for Bengali [5]. Moreover, generating such a large volume of computational resources (which may comprise an extensive rule base, a large volume of parallel corpora etc.) is not an easy task. EBMT scheme, on the other hand, is less demanding on computational resources making it more feasible to implement in respect of these languages.

### 3. Data preparation

### 3.1 Prepare knowledge base

Table 1 shows some example English - Bengali translations. Our EBMT system will store the translation rules in the knowledge base [6]. We also prepared English to Bengali Dictionary with Morphological Analysis.

ble1: Sample knowledge base of the English-Bengali EBMT system [1]

| English          | English Chunk                         | Transfer to Bengali Chunk             | Bengali           |
|------------------|---------------------------------------|---------------------------------------|-------------------|
| He reads a book  | [NP He/PRP] [VP reads/VBZ] [NP a/DT   | [NP(স/PRP][VP পড়ে /VBZ][NP           | (স একটি বই        |
|                  | book/NN]                              | একটি/DTব₹/NN ]                        | পড়ে              |
| The sun Rises in | [NPThe/DT sun/NN Rises/NNS] [PP       | [NP /DT সূর্য /NN উদিভ /NNS ] [PP     | সূৰ্য পূৰ্বে উদিভ |
| the east         | in/IN][NPthe/DT east/JJ]              | হয়/IN ] [NP <i>I</i> DT পূর্বে /JJ ] | र्म               |
| He is reading a  | [NP He/PRP ] [VP is/VBZ reading/VBG ] | [NP(স /PRP][VP /VBZ পড়ছে /VBG]       | (স এক টি বই       |
| book             | [NP a/DT book/NN]                     | [NP এক টি /DT বই /NN ]                | পড়ছে             |
| They are reading | [NPThey/PRP] [VP are/VBP              | [NP ভারা /PRP ] [VP /VBP পড়ছে        | ভারা এক টি বই     |
| a book           | reading/VBG][NP a/DT book/NN]         | /VBG ] [NP এক টি /DT বই /NN ]         | পড়ছে             |
| I have done the  | [NP I/PRP ] [VP have/VBP done/VBN ]   | [NP আমি /PRP ] [VP /VBP কাজটি         | আমি কাজটি         |
| work             | [NP the/DT work/NN]                   | /VBN ] [NP টি/DT কান্স/NN ]           | করেছি             |
| He has gone to   | [NP He/PRP ] [VP has/VBZ gone/VBN ]   | [NP(স /PRP ] [VP /VBZ গিয়াছে         | (স ঢাকা গিয়াছে   |
| Dhaka            | [PPto/TO][NP Dhaka/NNP]               | //BN ] [PP /TO ] [NP ঢाका /NNP ]      |                   |
| The boys were    | [NPThe/DT boys/NNS][VP were/VBD       | [NP /DT বালকগুলো /NNS ] [VP /VBD      | বালকগুলা          |
| playing          | playing/VBG]./.                       | (থলছিল /VBG ] ./.                     | (থলছিল            |

#### 3.2 Using WordNet

We connect with English WordNet to get information about word senses. It helps to detect Ambiguity and translate correctly from the rule.

### 4. Proposed EBMT Architecture

The proposed EBMT system has five steps [1]

- 1. Tagging the English sentence
- 2. Parsing the English sentence
- 3. Using sub-sentential EBMT prepare the chunks of the sentence
- 4. Using an efficient adapting scheme match the sentence rule [3].

5. Translate from Source Language (English) to Target Language (Bengali) in the chunk and generate with morphological analysis with the help of WordNet.

| Table  | 2: Sample | word rule | e for plura | 1 worde  |
|--------|-----------|-----------|-------------|----------|
| 1 abic | 2. Sample | word ruic | S IOI DIUIA | i woius. |

|            | অপ্রাণীবাচক | প্রাণীবাচক | সাধারণ | উদাহরণ       |               |
|------------|-------------|------------|--------|--------------|---------------|
| আবালি      | yes         | no         | no     | চরিতাবলি,    | পদাবলি        |
| কুল        | no          | yes        | no     |              |               |
| গণ         | no          | yes        | no     | মনুষগণ, (    | <u>1বভাগণ</u> |
| গাম        | yes         | yes        | no     |              |               |
| <b>इ</b> स | yes         | no         | no     |              |               |
| জন         | no          | yes        | no     | বিদ্বজন, প   |               |
| দাম        | yes         | no         | no     | লভাদাম, বি   | <u> </u>      |
| নিকর       | yes         | no         | no     |              |               |
| নিচ্য়     | yes         | no         | no     |              |               |
| মণ্ডল      | yes         | no         | no     | (মঘমণ্ডল     |               |
| মণ্ডলী     | no          | yes        | no     | পণ্ডিতমণ্ডৰী | Ì             |
| মালা       | yes         | no         | no     | (মঘমালা      |               |
| রাজি       | yes         | no         | no     | বৃষ্ণরাজি    |               |
| লোক        | no          | yes        | no     |              |               |
| বৰ্গ       | no          | yes        | no     | নেতৃবৰ্গ     |               |
| বৃন্দ      | no          | yes        | no     | সুধীবৃন্দ    |               |
| সকল        | no          | no         | yes    |              |               |
| সভা        | no          | yes        | no     | পণ্ডিতসভা    | যুবতীসভা      |
| সব         | no          | no         | yes    | ভাইসব        |               |
| সমূচ্য়    | no          | no         | yes    |              |               |
| সমূই       | no          | no         | yes    |              |               |
| মহল        | yes         | no         | no     |              | মহল, বন্দুমহল |
|            | রা          | গণ         | বৃন্দ  | মন্ডলী       | বৰ্গ          |
| শিশ্বক     | no          | yes        | yes    | yes          | no            |
| বালিকা     | yes         | no         | no     | no           | no            |
| গরিব       | yes         | no         | no     | no           | no            |
| ধনী        | yes         | no         | no     | no           | no            |
| (দব        | yes         | yes        | no     | yes          | yes           |
| নর         | yes         | yes        | no     | no           | no            |
| জন         | no          | yes        | no     | no           | no            |
| সুধী       |             | yes        | yes    | yes          | yes           |
| ভক্ত       |             |            | yes    | yes          | yes           |
| সম্পাদক    |             |            | yes    | yes          | yes           |
| পণ্ডিত     | yes         | yes        | no     | no           | yes           |

### 4.1 Tagging and parsing

Tagging, is the process of marking up the words in a text as corresponding to a particular part of speech, based on both its definition, as well as its context—i.e., relationship with adjacent and related words in a phrase, sentence, or paragraph. Eg. I do-> I/PRP do/VBP

Parsing, is the process of analyzing a sequence of tokens to determine grammatical structure with respect to a given formal grammar. We used the tag set of Table3 for tagging the English sentence. Eg. I am a boy-> (S (NP (PRP I)) (VP (VBP am) (NP (DT a) (NN boy))))

Table3: Tag set used in English-Bengali EBMT [10]

| Level 1   | Level 2              | Tag  |
|-----------|----------------------|------|
| Noun      | Common               | NN   |
|           | Proper               | NNP  |
|           | Compound Common Noun | NNC  |
|           | Compound Proper Noun | NNPC |
|           | Verb Root            | NNV  |
|           | Temporal             | NNT  |
|           | Question Temporal    | QNT  |
|           | Locative             | NNL  |
|           | Question Locative    | QNL  |
| Pronoun   | Personal Pronoun     | PRP  |
|           | Question Pronoun     | QPR  |
| Adjective | Simple               | JJ   |

| Vocatives         Vocatives         VOC           Verb         Main Finite Verb         VB           Nonfinite Nominal         VBM           Nonfinite Nominal         VBM           Nonfinite Conditional         VBC           Nonfinite Perfective         VBT           VBD         VBG           Past participle         VBB           Adverb         RB           Question Participle         VBB           Adverb         RB           Question Adverb         QRB           Conjunction         Condound Co-ordinating         CCC           Compound Co-ordinating         CCC           Compound Co-ordinating         CCS           Compound Subordinating         CSC           Compound Subordinating         CSC <tr< th=""><th></th><th>Verb Root</th><th>JJV</th></tr<>                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       |             | Verb Root                             | JJV  |
|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|-------------|---------------------------------------|------|
| VocativesVocativesVOCVerbMain Finite VerbVBNonfinite NominalVBMNonfinite NominalVBCNonfinite ConditionalVBCNonfinite PerfectiveVBTNonfiniteVBFPast tenseVBDGerund/present participleVBGPast participleVBNNon-3rd ps. sing. PresentVBP3rd ps. sing. PresentVBZExistentialVBEAdverbAdverbRBConjunctionCo-ordinatingCCCompound Co-ordinatingCCCSuspicionCNEternal JoiningCETSubordinatingCSCompound SubordinatingCSCompound SubordinatingCSNumbersCardinal NumbersCDInterjectionInterjectionUHParticleParticleRPDeterminerQuestion ParticleQRPDeterminerQuestion ParticleQRFDeterminerQuantifierQFForeignWordFWWordForeign WordFWSymbolSymbolSYMList ItemAccusativeSFACPossessiveAccusativeSFACPossessiveSF\$PunctuationSentence Final Punctuation.MarksComma.Colon, Semi-colon:Losing Right QuoteRQPreposition/subordinate<br>conjunctionINAdjective, superlativeJJR <td></td> <td></td> <td></td>                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 |             |                                       |      |
| Verb         Main Finite Verb         VB           Nonfinite Nominal         VBM           Nonfinite Perfective         VBT           Nonfinite         VBF           Adverb         VBB           Ander         VBP           3rd ps. sing. Present         VBP           Adverb         RB           Question Adverb         QRB           Conjunction         Co-ordinating         CCC           Compound Co-ordinating         CCC           Suspicion         CN         Eternal Joining         CET           Subordinating         CSC         Compound Subordinating         CSC           Compound Subordinating         CSC         Compound Subordinating         CSC           Interjection         UH         Particle         RP           Question Particle         QRP         QRP           Determiner         Common         DT           Question Particle                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   | Vocatives   |                                       |      |
| Nonfinite Nominal   VBM                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                          |             |                                       |      |
| Nonfinite Conditional   VBC                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                      | VEID        |                                       |      |
| Nonfinite Perfective VBF Nonfinite VBF Past tense VBD Gerund/present participle VBG Past past tense VBD Non-3rd ps. sing. Present VBP 3rd ps. sing. Present VBP Bexistential VBE Adverb Adverb RB Question Adverb QRB Conjunction Co-ordinating CCC Suspicion CN Eternal Joining CET Subordinating CS Compound Subordinating CSC Suspicion UH Particle Particle RP Question Particle QRP Determiner Common DT Singular QUBT Quantifier QF Foreign Word Foreign Word FW Symbol Symbol Symbol SYM List Item Marker List Item Marker LS Suffixes Adpositional SFON Accusative SFAC Possessive SF\$ Punctuation Marks Comma Colon, Semi-colon : Dash, Double-Dash - Opening Left Quote RQ Preposition/subordinate conjunction IN Adjective, superlative JJS Adjective, comparative JJR Modal MD Proper noun, plural NNPS Noun, plural NNS Possessive ending POS                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                           |             |                                       |      |
| Nonfinite   VBF                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                  |             |                                       |      |
| Past tense VBD Gerund/present participle VBG Past participle VBN Non-3rd ps. sing. Present VBP 3rd ps. sing. Present VBZ Existential VBE Adverb RB Question Adverb QRB Conjunction Co-ordinating CCC Suspicion CN Eternal Joining CET Subordinating CS Compound Subordinating CSC Interjection Interjection Interjection Particle Particle Question Particle QRP Determiner Common DT Singular DTS Question Determiner QDT Quantifier Quantifier QF Foreign Word Foreign Word FW Symbol Symbol Symbol SYM List Item Marker List Item Marker List Item Marker List Item Marker Sentence Final Punctuation Marks Comma Colon, Semi-colon Dash, Double-Dash Opening Left Quote LQ Closing Right Quote RQ Preposition/subordinate conjunction IN Adjective, superlative JJS Noun, plural NNPS Noun, plural NNPS Possessive ending POS Possessive pronoun PRP\$ Adverb, comparative RBR                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                               |             |                                       |      |
| Gerund/present participle Past participle VBN Non-3rd ps. sing. Present VBP  3rd ps. sing. Present VBZ Existential VBE  Adverb Adverb Question Adverb QRB Conjunction Co-ordinating CC Compound Co-ordinating CS Suspicion Eternal Joining CS Compound Subordinating CS Compound Subordinating CSC Compound Subordinating CSC Compound Subordinating CSC Compound Subordinating CSC Interjection Interjection UH Particle Particle Particle Question Particle QRP Determiner Common DT Singular DTS Question Determiner QDT Quantifier Poreign Word Foreign Word Foreign Word Foreign Word Symbol List Item Marker List Item Marker List Item Marker Accusative Possessive Possessive SF\$ Punctuation Marks Comma Colon, Semi-colon Dash, Double-Dash Opening Left Quote Closing Right Quote Preposition/subordinate conjunction IN Adjective, superlative JJR Modal MD Proper noun, plural NNPS Noun, plural NNPS Noun, plural NNPS Possessive ending POS Possessive ronoun PRP\$                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                |             |                                       |      |
| Past participle VBN Non-3rd ps. sing. Present VBP  3rd ps. sing. Present VBZ Existential VBE Adverb Adverb RB Question Adverb QRB Conjunction Co-ordinating CC Compound Co-ordinating CSC Suspicion CN Eternal Joining CET Subordinating CSC Compound Subordinating CSC Compound Subordinating CSC Interjection Interjection UH Particle Particle RP Question Particle QRP Determiner Common DT Singular DTS Question Determiner QDT Quantifier QF Foreign Word FW Symbol Symbol SYM List Item Marker List Item Marker List Item Marks Accusative SFAC Possessive SF\$ Punctuation Marks Comma Colon, Semi-colon : Dash, Double-Dash - Opening Left Quote LQ Closing Right Quote RQ Preposition/subordinate conjunction IN Adjective, superlative JJS Adjective, comparative JJR Noun, plural NNPS Noun, plural NNPS Possessive ronoun PRP\$ Adverb, comparative RBR To                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                          |             |                                       |      |
| Non-3rd ps. sing. Present 3rd ps. sing. Present Existential VBE Adverb Adverb Adverb Question Adverb QRB Conjunction Co-ordinating CCC Suspicion Eternal Joining CSC Subordinating CSC Compound Subordinating CSC Compound Subordinating CSC Numbers Cardinal Numbers Compound Subordinating CSC Interjection Particle Particle Particle Particle Question Particle QRP Determiner Common DT Singular DTS Question Determiner QDT Quantifier Quantifier Poreign Word Foreign Word Fymbol Symbol List Item Marker List Item Marker List Item Marker List Item Marker Accusative Possessive Possessive SF\$ Punctuation Marks Comma Colon, Semi-colon Dash, Double-Dash Opening Left Quote Closing Right Quote Preposition/subordinate conjunction Adjective, superlative Adjective, superlative JJS Noun, plural NNS Possessive ending Pos Possessive ending Pos Possessive pronoun PRP\$ Adverb, comparative RBR To                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                              |             |                                       |      |
| 3rd ps. sing. PresentVBZExistentialVBEAdverbAdverbRBQuestion AdverbQRBConjunctionCo-ordinatingCCCompound Co-ordinatingCCCSuspicionCNEternal JoiningCETSubordinatingCSCompound SubordinatingCSCNumbersCardinal NumbersCDInterjectionUHParticleRPQuestion ParticleQRPDeterminerCommonDTSingularDTSQuestion DeterminerQDTQuantifierQuestion DeterminerQFForeignWordForeign WordFWSymbolSymbolSYMList ItemMarkerLsMarkerList Item MarkerLsSuffixesAdpositionalSFONAccusativeSFACPossessiveSF\$PunctuationSentence Final Punctuation.MarksComma,Colon, Semi-colon:Dash, Double-Dash-Opening Left QuoteLQClosing Right QuoteRQPreposition/subordinate<br>conjunctionINAdjective, superlativeJJRModalMDProper noun, pluralNNPSNoun, pluralNNPSNoun, pluralNNPSAdverb, comparativeRBRToTO                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                |             |                                       |      |
| AdverbExistentialVBEAdverbAdverbRBQuestion AdverbQRBConjunctionCo-ordinatingCCCompound Co-ordinatingCCCSuspicionCNEternal JoiningCETSubordinatingCSCompound SubordinatingCSCNumbersCardinal NumbersCDInterjectionInterjectionUHParticleParticleRPDeterminerCommonDTSingularDTSQuestion ParticleQFPoreignWordFORWordForeign WordFWSymbolSymbolSYMList ItemAccusativeFSACPossessiveSF\$PunctuationAccusativeSFACPossessiveSF\$PunctuationSentence Final Punctuation.MarksComma,Colon, Semi-colon:Dash, Double-Dash-Opening Left QuoteLQClosing Right QuoteRQPreposition/subordinate<br>conjunctionINAdjective, superlativeJJSAdjective, comparativeJJRModalMDProper noun, pluralNNPSNoun, pluralNNPSNoun, pluralNNPSAdverb, comparativeRBRToTO                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                     |             | Non-3rd ps. sing. Present             |      |
| Adverb Adverb QRB  Conjunction Co-ordinating CC  Compound Co-ordinating CCC  Suspicion CN  Eternal Joining CET  Subordinating CS  Compound Subordinating CSC  Numbers Cardinal Numbers CD  Interjection Interjection UH  Particle Particle RP  Question Particle QRP  Determiner Common DT  Singular DTS  Quantifier Quantifier QF  Foreign Word Foreign Word FW  Symbol Symbol Symbol SYM  List Item Marker List Item Marker LS  Suffixes Adpositional SFON  Accusative SFAC  Possessive SF\$  Punctuation Marks Comma  Colon, Semi-colon Senious Preposition/subordinate conjunction IN  Adjective, superlative JJS  Adjective, comparative JJR  Modal MD  Proper noun, plural NNS  Possessive pronoun PRP\$  Adverb, comparative RBR  RB  RBB  RCC  COMPO  COMPO  COMPO  COCC  COCC |             |                                       |      |
| ConjunctionQuestion AdverbQRBConjunctionCo-ordinatingCCCompound Co-ordinatingCCCSuspicionCNEternal JoiningCETSubordinatingCSCompound SubordinatingCSCNumbersCardinal NumbersCDInterjectionInterjectionUHParticleParticleRPQuestion ParticleQRPDeterminerCommonDTSingularDTSQuestion DeterminerQDTQuantifierQuantifierQFForeignFWWordForeign WordFWSymbolSymbolSYMList ItemSymbolSYMMarkerList Item MarkerLSSuffixesAdpositionalSFONAccusativeSFACPossessiveSF\$PunctuationSentence Final Punctuation.MarksColon, Semi-colon:Dash, Double-Dash-Opening Left QuoteLQClosing Right QuoteRQPreposition/subordinate<br>conjunctionINAdjective, superlativeJJRModalMDProper noun, pluralNNPSNoun, pluralNNSPossessive endingPOSPossessive pronounPRP\$Adverb, comparativeRBRToTO                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       | A 11.       |                                       |      |
| Conjunction         Co-ordinating         CC           Compound Co-ordinating         CCC           Suspicion         CN           Eternal Joining         CET           Subordinating         CS           Compound Subordinating         CSC           Numbers         Cardinal Numbers         CD           Interjection         UH           Particle         RP           Question Particle         QRP           Determiner         Common         DT           Singular         DTS           Question Determiner         QDT           Quantifier         Question Determiner         QP           Quantifier         QF           Foreign         Word         FW           Symbol         Symbol         SYM           List Item         Symbol         SYM           List Item         Marker         List Item Marker         LS           Suffixes         Adpositional         SFON           Accusative         SF\$           Punctuation         Sentence Final Punctuation         .           Colon, Semi-colon         :           Dash, Double-Dash         -           Opening Left Quote                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                  | Adverb      |                                       |      |
| Compound Co-ordinating CCC Suspicion CN Eternal Joining CET Subordinating CSC Compound Subordinating CSC Numbers Cardinal Numbers CD Interjection Interjection UH Particle Particle RP Question Particle QRP Determiner Common DT Singular DTS Quantifier Quantifier QF Foreign Word Foreign Word FW Symbol Symbol SYM List Item Marker List Item Marker List Item Marker Suffixes Adpositional SFON Accusative SFAC Possessive SF\$ Punctuation Marks Colon, Semi-colon Comma Colon, Semi-colon Copening Left Quote Closing Right Quote RQ Preposition/subordinate conjunction IN Adjective, superlative JJR Modal Proper noun, plural NNPS Noun, plural Possessive Possessive Possessive comparative RBR Nour Possessive Possessive RSF\$ Noun, plural NNS Possessive ending POS Possessive Possessive RBR RBR Possessive POSS                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 | G : ::      |                                       |      |
| SuspicionCNEternal JoiningCETSubordinatingCSCompound SubordinatingCSCNumbersCardinal NumbersCDInterjectionInterjectionUHParticleParticleRPQuestion ParticleQRPDeterminerCommonDTSingularDTSQuestion DeterminerQDTQuantifierQuantifierQFForeignFWWordForeign WordFWSymbolSymbolSYMList ItemMarkerLSSuffixesAdpositionalSFONAccusativeSFACPossessiveSF\$Punctuation<br>MarksComma,Colon, Semi-colon:Dash, Double-Dash-Opening Left QuoteLQClosing Right QuoteRQPreposition/subordinate<br>conjunctionINAdjective, superlativeJJSAdjective, comparativeJJRModalMDProper noun, pluralNNPSNoun, pluralNNSPossessive endingPOSPossessive pronounPRP\$Adverb, comparativeRBR                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                            | Conjunction |                                       |      |
| Eternal Joining CET Subordinating CS Compound Subordinating CSC Numbers Cardinal Numbers CD Interjection Interjection UH Particle Particle RP Question Particle QRP Determiner Common DT Singular DTS Question Determiner QDT Quantifier QF Foreign Word Foreign Word FW Symbol Symbol Symbol SYM List Item Marker List Item Marker List Item Marker Suffixes Adpositional SFON Accusative SFAC Possessive SF\$ Punctuation Sentence Final Punctuation . Marks Comma , Colon, Semi-colon : Dash, Double-Dash - Opening Left Quote LQ Closing Right Quote RQ Preposition/subordinate conjunction IN Adjective, superlative JJR Modal MD Proper noun, plural NNPS Noun, plural NNS Possessive pronoun PRP\$ Adverb, comparative RBR PRD  RD  RP  RP  RP  RP  RP  RP  RP  COD  COMMON  COMMON  COD  COD  COD  COD  COD  COD  COD  C                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 |             |                                       |      |
| SubordinatingCSCompound SubordinatingCSCNumbersCardinal NumbersCDInterjectionInterjectionUHParticleParticleRPQuestion ParticleQRPDeterminerCommonDTSingularDTSQuestion DeterminerQDTQuantifierQuantifierQFForeignWordFWSymbolSymbolSYMList ItemMarkerLSSuffixesAdpositionalSFONAccusativeSFACPossessiveSF\$PunctuationSentence Final Punctuation.MarksComma,Colon, Semi-colon:Dash, Double-Dash-Opening Left QuoteLQClosing Right QuoteRQPreposition/subordinate<br>conjunctionINAdjective, superlativeJJSAdjective, comparativeJJRModalMDProper noun, pluralNNPSNoun, pluralNNSPossessive endingPOSPossessive pronounPRP\$Adverb, comparativeRBR                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                |             |                                       |      |
| Numbers Cardinal Numbers CD Interjection Interjection UH Particle Particle RP  Question Particle QRP Determiner Common DT Singular DTS Question Determiner QDT Quantifier Quantifier QF Foreign Word Foreign Word FW Symbol Symbol Symbol SYM List Item Marker List Item Marker List Item Marker Suffixes Adpositional SFON Accusative SFAC Possessive SF\$ Punctuation Marks Comma , Colon, Semi-colon : Dash, Double-Dash - Opening Left Quote LQ Closing Right Quote RQ Preposition/subordinate conjunction IN Adjective, superlative JJS Adjective, comparative JJR Noun, plural NNS Possessive pronoun PRP\$ Adverb, comparative RBR                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                        |             |                                       |      |
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| Interjection                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                     |             | Compound Subordinating                |      |
| Particle Particle QRP  Question Particle QRP  Determiner Common DT  Singular DTS  Question Determiner QDT  Quantifier Quantifier QF  Foreign Word Foreign Word FW  Symbol Symbol SYM  List Item Marker List Item Marker LS  Suffixes Adpositional SFON  Accusative SFAC  Possessive SF\$  Punctuation Marks Comma ,  Colon, Semi-colon :  Dash, Double-Dash -  Opening Left Quote LQ  Closing Right Quote RQ  Preposition/subordinate conjunction IN  Adjective, superlative JJS  Adjective, comparative JJR  Modal MD  Proper noun, plural NNPS  Noun, plural NNS  Possessive pronoun PRP\$  Adverb, comparative RBR  RD  DAN  PROP  PROP  PROP  PROP  Adverb, comparative RBR  RD  PROP  RD  RD  RD  RD  RD  RD  RD  RD  RD  R                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 |             |                                       |      |
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| Adjective, comparative JJR  Modal MD  Proper noun, plural NNPS  Noun, plural NNS  Possessive ending POS  Possessive pronoun PRP\$  Adverb, comparative RBR  To TO                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                |             | v                                     |      |
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| Proper noun, plural NNPS  Noun, plural NNS  Possessive ending POS  Possessive pronoun PRP\$  Adverb, comparative RBR  To TO                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                      |             | · · · · · · · · · · · · · · · · · · · |      |
| Noun, plural NNS Possessive ending POS Possessive pronoun PRP\$ Adverb, comparative RBR To TO                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    |             |                                       |      |
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| Adverb, comparative RBR To TO                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    |             |                                       |      |
| To TO                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                            |             |                                       |      |
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| wh_determiner W/DT                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                               |             |                                       |      |
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| wh-pronoun WP                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    |             |                                       |      |
| Possessive wh-pronoun WP\$                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       |             | Possessive wh-pronoun                 | WP\$ |

### **4.2** Handle complex sentence using sub-sentential EBMT

Handling complex sentence in general considered to be difficult to deal with in an MT system. Since exact sentence matches only occur in special domains, we want to extend this to sub-sentence matches. For this we need to:

- Find the most similar example (involves segmenting by preparing chunks)
- Alter source side to match current input. Similarity requires a "distance metric" in the source language (English). This can be closeness:
- of the lexical items in a hierarchy of terms/ concepts from ontology
- of the sequence of syntactic categories and function words,
- of the two syntactic structures,
- or combinations of these.

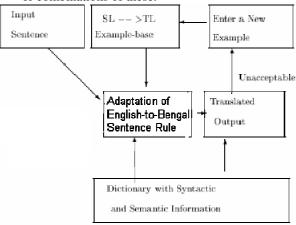


Figure 1: Role of Examples in Translation

### 4.3 Adapting scheme to match sentence rule

Efficient adaptation of past examples is a major aspect of an EBMT system. There are many adaptation schemes available for an EBMT system. Even an efficient similarity measurement scheme and a quite large example base cannot guarantee an exact match for a given input sentence. As a consequence, there is a need for an efficient and systematic adaptation scheme for modifying a retrieved example, and thereby generating the required translation. In section 5 we discuss details about our proposed adaptation scheme. In Table1 we gave a Sample knowledge base of the English to Bengali EBMT System. During translation our adapting scheme chooses the best rule for the source sentence.

## 4.3 Translate with morphological analysis with the help of WordNet.

Study of divergence for English to Bengali translation is also required. Translation divergence can be effectively handled within an EBMT framework. As in earlier step we have the sample rule and the parsed sentence. Now we can easily translate the sentence by matching the rule.

I am a boy > ami ekti chele

I am a man > ami ekjon manus

In these two examples "a" has different meaning in Bengali "jon" and "ti". Here we can see that it has same sentence rule but different translation. Depending on the quality of the word we are choosing the actual meaning. Using WordNet we are determining that word sense. This technique dramatically improves the quality of EBMT. For all birds plural we can use -kul

- Birds are flying > pakhikul akashe urchhe
- Parrots are flying> totapakhikul akashe urchhe But for trees we have to use -raji
- Trees give us food> brikkhoraji amader khaddo dev

From the above example we see that in Bengali based on Noun quality different pos-fix used. Using WordNet and Table2 we can easily identify the ambiguity and translate correctly.

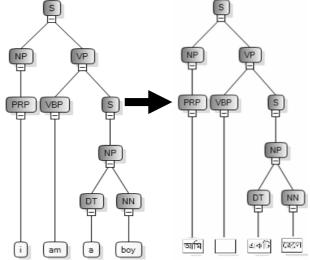


Figure 2: Translating English-Bengali

# 5. Adaptation in English to Bengali translation

A successful EBMT system requires a good adaptation scheme. The need for an efficient and systematic adaptation scheme arises for modifying a retrieved example, and thereby generating the required translation. Researcher came with various approaches to deal with adaptation aspect of an EBMT system. Overall the adaptation procedures employed in different EBMT systems primarily consist of four operations [4]:

- Copy, where the same chunk of the retrieved translation example is used in the generated translation;
- Add, where a new chunk is added in the retrieved translation example;
- Delete, when some chunk of the retrieved example is deleted; and
- Replace, where some chunk of the retrieved example is replaced with a new one to meet the requirements of the current input.

### 5.1 Adaptability/Map ability for a chunk has 4 discrete values:

Level 3: Source Language (SL): Target Language (TL) mapping is one-to-one for all words

Level 2: Syntactic Functions map, but not some POS tags Level 1: Functions differ, but lexical correspondence still holds

Level 0: Cannot establish correspondence

### 5.2 Description of the adaptation operations

- i. Constituent Word Replacement (WR): One may get the translation of the input sentence by replacing some words in the retrieved translation example. Suppose the input sentence is: "The bird was eating apples.", and the most similar example retrieved by the system (along with its Bengali translation) is: "The elephant was eating fruits", "haathii phol khacchilo". The desired translation may be generated by replacing "haathii" with the Bengali of "birds", i.e. "pakhi" and replacing "phal" with the Bengali of "apples", i.e. "aapel". These are examples of the operation of constituent word replacement.
- ii. Constituent Word Deletion (WD): In some cases one may have to delete some words from the translation example to generate the required translation. For example, suppose the input sentence is: "Animals were dying of thirst". If the retrieved translation example is: "Birds and Animals were dying of thirst.", "pakhi ebong pashu trishnay mara jacche", then the desired translation can be obtained by deleting "pakhi ebong" (i.e the Bengali of "birds and") from the retrieved translation. Thus the adaptation here requires two constituent word deletions.
- iii. Constituent Word Addition (WA): This operation is the opposite of constituent word deletion. Here addition of some additional words in the retrieved translation example is required for generating the translation. For illustration, one may consider the example given above with the roles of input and retrieved sentences being reversed.
- iv. Morpho-word Replacement (MR): In this case one morpho-word is replaced by another morpho-word in the retrieved translation example. For illustration, if the input sentence is "He eats rice", and the retrieved example is: "He is reading a book.", "se akte boi porChe", then to obtain the desired translation4 first the morpho-word "Che" is to be replaced by "e"
- v. Morpho-word Deletion (MD): Here some morphoword(s) are deleted from the retrieved translation example.
- vi. Morpho-word Addition (MA): This is the opposite case of morpho-word deletion. Here some morpho-words need to be added in the retrieved example in order to generate the required translation.
- vii. Suffix Replacement (SR): Here the suffix attached to some constituent word of the retrieved sentence is replaced with a different suffix to meet the current translation requirements. This may happen with respect to noun, adjective verb, or case ending.
- viii. Suffix Deletion (SD): By this operation the suffix attached to some constituent word may be removed, and thereby the root word may be obtained.
- ix. Suffix Addition (SA): Here a suffix is added to some constituent word in the retrieved example.
- x. Copy (CP): When some word (with or without suffix) of the retrieved example is retained in to in the required translation then it is called a copy operation.

### 5.3 Study of adaptation procedure for morphological variation of active verbs

Verb morphology variations are divided into four groups. These are:

- 1. Same tense same verb form
- 2. Different tenses same verb form
- 3. Same tense different verb forms
- 4. Different tenses different verb forms

### 6. Summary

In this current research we focused to improve English to Bengali EBMT. Presently our system can deal with simple English sentence to translate into Bengali as it has limited knowledge base. By increasing the knowledge base we can improve the correctness of the translation.

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