

Bengali and Magahi PUD Treebank and Parser

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Abstract

This paper presents the development of the Parallel Universal Dependency (PUD) Treebank for two Indo-Aryan languages: Bengali and Magahi. A treebank of 1,000 sentences has been created using a parallel corpus of English and the UD framework. A preliminary set of sentences was annotated manually - 600 for Bengali and 200 for Magahi. The rest of the sentences were built using the Bengali and Magahi parser. The sentences have been translated and annotated manually by the authors, some of whom are also native speakers of the languages. The objective behind this work is to build a syntactically-annotated linguistic repository for the aforementioned languages, that can prove to be a useful resource for building further NLP tools. Additionally, Bengali and Magahi parsers were also created which is built on machine learning approach. The accuracy of the Bengali parser is 78.13% in the case of UPOS; 76.99% in the case of XPOS, 56.12% in the case of UAS; and 47.19% in the case of LAS. The accuracy of Magahi parser is 71.53% in the case of UPOS; 66.44% in the case of XPOS, 58.05% in the case of UAS; and 33.07% in the case of LAS. This paper also includes an illustration of the annotation schema followed, the findings of the Parallel Universal Dependency (PUD) treebank, and its resulting linguistic analysis.

Keywords: Indian languages, Bengali, Magahi, Parallel Universal Dependency Treebank, parser

1. Introduction

Sentence parsing is one of the trickiest, yet essential components in the field of Natural Language Processing (NLP). Parsing not only enables better understanding of a sentence structure, but is also useful in the development of various NLP applications like machine translation, and information retrieval. In this paper, we aim to discuss Parallel Universal Dependency (PUD) treebank and parser for two Indian languages, namely, Bengali and Magahi. Bengali, also referred as Bangla, is mostly spoken in the Indian regions of West Bengal, Assam, and Tripura and is the mother tongue of about 97.2 million speakers as per the 2011 Census Report of India.¹ It is one of the 22 scheduled Indian languages and the national language of Bangladesh. Magahi is an Eastern Indo-Aryan language spoken mostly in the Indian states of Bihar and certain areas of Jharkhand. Linguistically, both the languages belong to the Indo-Aryan language family, follow a Subject-Object-Verb (SOV) construction and are head-final languages with a relatively free word order. Like several other Indian languages, they also follow the post-position trait. They are also nominative-accusative languages that allow pro-drop of all arguments, contain complex verb constructions, rich classifiers, differential object marking and has no assigned gender. The verbs show only person agreement with the subject and no agreement with number

and gender. However, a distinctive feature of Bengali is that the copula or verb linking the subject and predicate is often found missing in this language.

The objective of UD is to automatically analyze dependency structure of sentences, create multilingual parsers for cross lingual learning, and conduct parsing research for typologically diverse languages under a common framework.² The annotation scheme is based on Stanford dependencies (De Marneffe and Manning, 2008), Google universal part of speech, (Petrov et al., 2011) and the Intersect Interlingua for morphosyntactic tag sets (Zeman, 2008). Currently, the UD project contains more than 217 treebanks for 122 languages belonging to 24 language families.³

It would however be ignorant to state that Indian languages have not progressed at all in the field of NLP (See section-2). The extent and the contribution of their work will be discussed in the later sections of the paper. Nevertheless, discussion on development of PUD treebank and a parser for the above stated languages with English as the source language is what is aimed in this paper.

Section (2), provides an overview of the linguistic resources that have been created for Indian languages. Section (3), discusses the experiment and the data size used to build the parser for the respective languages. Section (4), demonstrates the

¹<https://censusindia.gov.in/2011Census/Language-2011/Statement-1.pdf>

²<https://universaldependencies.org/introduction.html>

³<https://universaldependencies.org/>

development of the parser and its outcome. Section (5), illustrates the cross-lingual study of the UD treebank built in this project. The paper concludes with closing remarks and plans for future work.

2. Related Work

In 1991, an initiative was taken up by Technology Development for Indian languages (TDIL), to develop tools for POS tagging, frequency count, spell checkers, and morphological processing for all Indian national (official/scheduled) languages. Thus, a corpus of 3 million words was created for every Indian national language by the end of 1994, including Bengali (Dash, 2004). As per (Kumar et al., 2018), a corpus of 0.17 million sentences is available in Magahi. In 2013, Indian Institute of Information Technology, Hyderabad (IIIT-H) developed monolingual and parallel Pāṇinian Kāraḥa Dependency (PD) treebanks for Indian languages Hindi, Bengali, Marathi, Kannada and Malayalam.⁴ The same was then utilized to annotate Telugu, Urdu, Kashmiri (Bhat, 2017) and a dependency parser for Hindi, Telugu, Bengali, Urdu and Kashmiri was created. Presently, IIIT-H⁵ is developing PD treebanks for Indian languages, Bengali, Kannada, Hindi and Malayalam.

As of UD release 2.9, 217 treebanks including the Indian languages, Bhojpuri, Marathi, Hindi, Sanskrit, Tamil, Telugu and Urdu are available (Zeman, 2021).⁶ In addition, Magahi UD and Bengali PUD treebanks have been recently reported by (Raj et al., 2021) and (Majumdar, 2021) at *Workshop on Parsing and its Applications for Indian Languages* (in progress) and *Widening NLP workshop 2021* respectively. However, the Bengali UD treebank that was reported at WiNLP has been modified to improve the quality of translation and annotation for the requirements of this paper. Nonetheless, there has been no prior work/resources in Magahi PUD Treebank.

3. Data & Methodology

In order to build the Bengali and Magahi PUD, the English sentences have been taken as the source text from the English PUD (Zeman et al., 2017) which was further translated into the respective target languages, preparing it for the corresponding treebank annotation. In this study both manual and automatic annotation schemas were followed. The sentence alignment is 1-1 but occasionally a sentence-level segment actually consists of two real sentences. The data has been collected from the news domain and Wikipedia. The

⁴<https://www.meity.gov.in/content/language-computing-group-vi>

⁵<https://kcis.iiit.ac.in/LT/>

⁶<http://hdl.handle.net/11234/1-4611>

corpus was then annotated for parts of speech, which was further divided into universal parts of speech (UPOS) and language specific parts of speech (XPOS), and dependency relations. The Bureau of Indian Standards (BIS) tagset⁷ has been used for language specific POS tags (Choudhary and Jha, 2014; Ojha and Zeman, 2020). Out of the 37 universal dependency relations, 29 deprel have been used in Bengali and 31 in Magahi (The statistics are given in Table 2). All the 17 UPOS have been used for both Bengali and Magahi (The statistics are given in Table 1). The number of tokens reported for the Bengali and Magahi sentences are 13,110 and 7,575 respectively. Eventually, a total of 50 Bengali sentences were made available for validation to three inter-annotators - native speakers of the language. A kappa score of 0.942613, per dependency, was thus derived. However, we could not do inter-annotators agreement for Magahi.

UPOS Tags	Description	Bengali Statistics	Magahi Statistics
NOUN	Noun	3815	1775
VERB	Verb	1590	780
PUNCT	Punctuation	1720	755
PROPN	Proper noun	805	430
ADJ	Adjective	1275	495
ADP	Adposition	815	1275
DET	Determiner	615	305
PRON	Pronoun	764	214
CCONJ	Coordinating conjunction	385	155
ADV	Adverb	440	150
NUM	Numeral	226	231
PART	Particle	130	110
AUX	Auxiliary	904	783
SCONJ	Subordinating conjunction	270	150
SYM	Symbol	55	33

Table 1: Statistics of used UPOS Tags in the Bengali and Magahi PUD treebank

4. Development of Bengali & Magahi Parser

As mentioned earlier, the Bengali and Magahi treebank was manually annotated using the UD annotation framework. Both, Bengali and Magahi parsers were built on 600 and 200 sentences. The experiment was conducted in two steps.

- **Bengali:** Experiment-1 was run on 200 sentences while Experiment-2 was conducted on

⁷<http://tdil-dc.in/tdildcMain/articles/134692Draft%20POS%20Tag%20standard.pdf>

UD Relations	Description	Bengali Statistics	Magahi Statistics
advmod	Adverbial modifier	530	195
amod	Adjectival modifier of noun	908	324
aux	Auxiliary verb	555	385
case	Case marker	780	1215
cc	Coordinating conjunction	234	102
ccomp	Clausal complement	156	92
compound	Compound	1210	792
conj	Non-first conjunct	276	108
cop	Copula	12	51
det	Determiner	585	175
fixed	Non-first word of fixed expression	180	115
flat	non-first word of flat structure	120	102
goeswith	Non-first part of broken word	-	1
iobj	Indirect object	42	12
mark	Subordinating marker	286	165
nmod	Nominal modifier of noun	995	429
nsubj	Nominal subject	1193	22
nummod	Numeric modifier	186	193
obj	Direct object	179	57
obl	Oblique nominal	860	556
punct	Punctuation	1710	808
root	Root	1000	1000
xcomp	Open clausal complement	230	88

Table 2: Statistics of used UD relations in Bengali and Magahi PUD trebank

600 sentences with the aid of UDPipe open source tool (Straka and Straková, 2017). Cross-validation with an average of 90:10 was used for data splitting where the batch size, learning rate, dropout and embedding size were 50, 0.005, 0.10, 200 respectively, while the other hyper-parameters were randomized for each experiment.

- **Magahi:** Magahi’s Experiment-1 was run on

200 sentences using UDPipe similar to Bengali. The data splitting and training features were also the same. Experiment-2 was built on multilingual multi-task model with the aid of UDify open source tool (Konratyuk and Straka, 2019). We used the same Magahi sentences. In this experiment, the training configurations and features were default including data splitting, batch size, epoch, learning rate, and multilingual BERT layer.

The results are demonstrated in Table 3:

Language	Experiment Details	UPOS	XPOS	UAS	LAS
Bengali	Experiment 1	51.25	62.04	30.23	35.13
Bengali	Experiment 2	78.13	76.09	56.12	47.19
Magahi	Experiment 1	68.08	69.18	34.0	41.74
Magahi	Experiment 2	71.53	66.44	58.05	33.07

Table 3: Results (%) of the Bengali and Magahi Parser

5. Cross-lingual Analysis of Bengali & Magahi PUD

In this section, an extensive linguistic illustration of the language pairs following the annotation schema of the UD v2 guidelines is discussed.

5.1. Nominals

The nominals are divided into three categories in UD - the core arguments, the non-core arguments, and the nominal dependents. These include nsubj (nominal subject), obj (object), iobj (indirect object) under core arguments. The non-core dependents include obl (oblique), vocative, expel (expletive), and dislocated. Lastly, the nominal dependents include nmod (nominal modifier), appos (appositional modifier), and nummod (numeric modifier). In core arguments, nsubj and obj are the most frequently used relations followed by the non-core argument obl. With respect to the nominal dependents, nmod with its subtype nmod:poss is the most frequent followed by the dependency relation nummod.

Figure 1 and Figure 2, showcase the presence of the nominal relations nsubj, obj, iobj, obl. The verb জানিয়েছেন ‘*janiyechen*’ is the root of the sentence. The noun প্রত্যক্ষদর্শী ‘*protokkhodorshi*’ is the nsubj, and the noun পুলিশ ‘*police*’ is the iobj, both of which are dependent on the root. In the lower clause, the noun এপ্রিল ‘*april*’ acts as the obl and the noun ব্যক্তি ‘*byekti*’ acts as the obj, both dependent on the verb করেছিল ‘*korechilo*’, which is further dependent on the root via ccomp relation. In

the same way, in Magahi, the noun गबाह ‘*gabaah*’ ‘witness’ is the nsubj of the root ‘told’, and the noun पुलिस ‘*pulis*’ ‘police’ is the iobj. On the other hand, in the lower clause पीड़ित आदमी अप्रील में संदिग्ध आदमी पर हमला कैलकई हल ‘*piirIt aadamii april meN sandigdh aadamii par hamalaa kailkai hal*’ ‘the victim had attacked the suspect in April’, which is dependent on the root ‘told’ via ccomp relation, the noun अप्रील ‘*april*’ ‘April’, has obl relation with the lower verb हमला कैलकई ‘*hamalaa kailkai*’ ‘attack’. There are also nsubj and obj in the lower clause, the nominal पीड़ित आदमी ‘*piirIt aadamii*’ ‘victim’ and संदिग्ध ‘*sandigdh*’ ‘suspect’ respectively.

5.2. Clauses

In UD, clauses are categorized into five- csubj (clausal subject), ccomp (clausal complement), xcomp (open clausal complement), advcl (adverbial clause modifier), and acl (adnominal clause). The four relations ccomp, xcomp, advcl, and acl are frequently found in both Bengali and Magahi, leaving the csubj. We illustrate xcomp and advcl relations here (see figure 1 and figure 2 where ccomp relation is mentioned.)

The following illustrations, Figure 3, and Figure 4 showcase an example of a clausal construction in Bengali and Magahi respectively. In both the languages, the verb kill মেরে ‘*mere*’ in Bengali and मारे ‘*maare*’ in Magahi, which are dependent on the verb root, carry the xcomp relation. The verb चेष्टा করার ‘*chesta korar*’, ‘try do-PRESENT-CONTINUOUS in Bengali and परयास करे ‘*paraas kare*’, ‘try do’ in Magahi, have advcl relation with the verb kill.

5.3. Predicates

In this section, we will discuss two types of predicate constructions - simple verb construction and compound verb construction. The compound verb construction can further be subdivided into serial verbs and light verb constructions since Indian languages are rich in compound formation. A simple verb construction contains only the verb, which in UD terms is often referred to as the root, and sometimes combines the verb with an auxiliary. A light verb compound construction is formed by combining the main verb (taken as the root) and a corresponding noun/adjective which is dependent on the root. A serial verb compound formation is the amalgamation of the main verb and a corresponding serial verb, which is again dependent on the main verb.

Figure 5 and Figure 6 showcase an example of a simple verb construction in Bengali and Magahi respectively, wherein the verb মনে ‘*mone*’ acts as the root and is combined with the auxiliary হয়ে ‘*hoye*’ in Bengali and होब ‘*hobe*’ acts as the root and is combined with the auxiliary है ‘*he*’ in Magahi.

The Figure 1 and Figure 3 illustrated, also showcase a light verb compound construction in Bengali, wherein the noun অভিযোগে ‘*obhijoge*’ ‘complaints’ is dependent on the verb করা ‘*kora*’ ‘to-do’ and carries the compound:lvc relation in Figure 3. The noun আক্রমণ ‘*akromon*’ ‘attack’ is dependent on the verb করেছিল ‘*korechilo*’ ‘did’ and carries the compound:lvc relation in Figure 1. In the same way, the Figure 2 and Figure 4 illustrated, showcase a light verb compound construction in Magahi, wherein the noun आरोप ‘*aaropa*’ ‘complaints’ is dependent on the verb लगाबल ‘*la-gaabala*’ ‘place’ and carries the compound:lvc relation in Figure 4 and the noun हमला ‘*hamalaa*’ ‘attack’ is dependent on the verb कैलकई ‘*kailkai*’ ‘did’ and carries the compound:lvc relation in Figure 2. Compound verb formation is a very common construction found in both Bengali and Magahi.⁸

There is also the presence of another type of predicate construction in UD wherein the adjective or noun acts as the root. In Magahi, it is seen that the noun/adjective is combined with the copula, wherein the corresponding noun/adjective acts as the root of the sentence. However, since Bengali lacks copular construction, the noun/adjective itself acts as the root and the other relations are further dependent on it. Figure 7 showcases such a construction in Bengali, wherein the adjective গুমোট ‘*gumot*’ ‘stuffy’ acts as the root of the sentence, and Figure-8 illustrates it in Magahi, wherein the adjective उबाऊ ‘*ubaauu*’ ‘stuffy’ is a root of the sentence.

5.4. Coordination

The figures, 9 and 10, showcase examples of coordination constructions. In UD, a conjunct (conj) is a relation between two elements which are connected by a coordinating conjunction (cc). The first conjunct serves as the head and the second conjunct is related to the first through the cc.

The example, Figure 9, showcases a coordination relation in Bengali, wherein the noun স্পনসরশিপ ‘*sponsorship*’ acts as the first conjunct and the noun বিজ্ঞাপন ‘*biggapon*’ acts as the second conjunct and are joined with the coordinating conjunction এবং ‘*ebong*’. Similarly, Figure 10 showcases a coordination relation in Magahi. The noun परयोजन ‘*pariyojanaa*’ ‘sponsorship’ is the first conjunct and the noun बिज्ञापन ‘*biggyaapana*’ ‘advertising’ is the second conjunct, which are conjoined by a coordinating conjunction आउ ‘*aaU*’ ‘and’.

⁸There could be a different view on which element acts as a root in such a construction (e.g., a noun/adjective is a root and the verb depends on it). We have assumed that the verb is a root and a noun/adjective depends on it. Arguing here in favor of our view will take us in a different direction. Also, there is a space constraint.

Conclusion and Future work

This paper presented an attempt in developing a PUD treebank and a parser for the Indian languages, Bengali and Magahi. Currently, the treebanks consist of 1, 000 sentences. The annotation schema, tags used, and linguistic analysis have also been discussed in the sections above. The built Bengali and Magahi PUD treebank will be publicly released in the UD repository.^{9,10}

In the near future, we plan to encode the morphological information in the same PUD treebank for better usage of the built resource. Additionally, a plan to develop a robust parser on 1,000 parallel annotated sentences using zero-shot and to build an enhanced quality of Machine Translation models and NLP tools will also be aimed. Finally, an attempt will be made in increasing the number of sentences to a minimum of 100 for inter-annotator agreement in both the languages to achieve a better understanding of the quality of annotation.

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⁹https://github.com/UniversalDependencies/UD_Bengali-PUD

¹⁰https://github.com/UniversalDependencies/UD_Magahi-PUD

7. Appendix

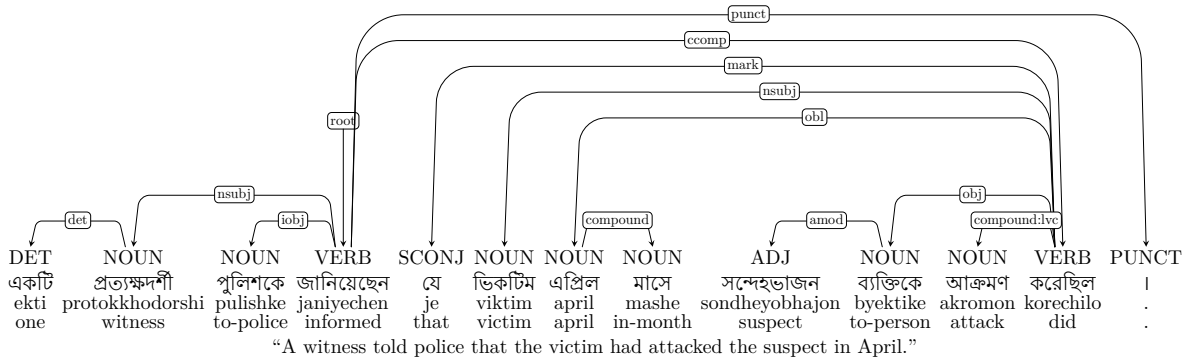


Figure 1: A parallel Bengali construction illustrating the nominal relations

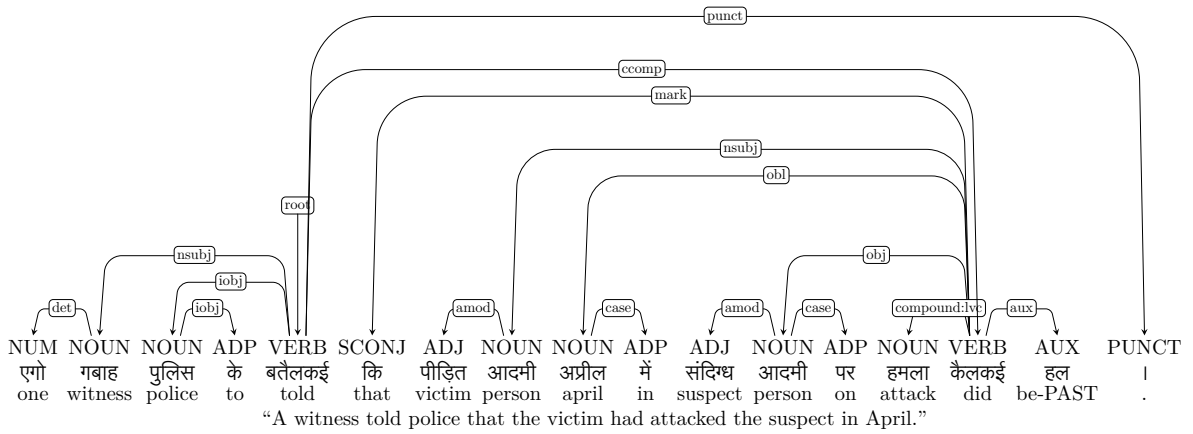


Figure 2: A parallel Magahi construction illustrating the nominal relations

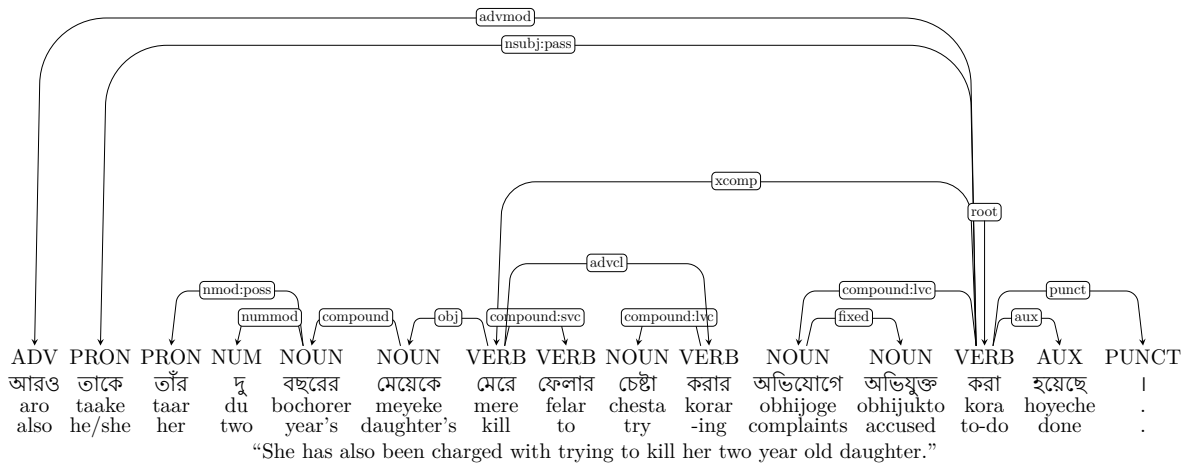


Figure 3: A parallel Bengali construction illustrating the clausal relation

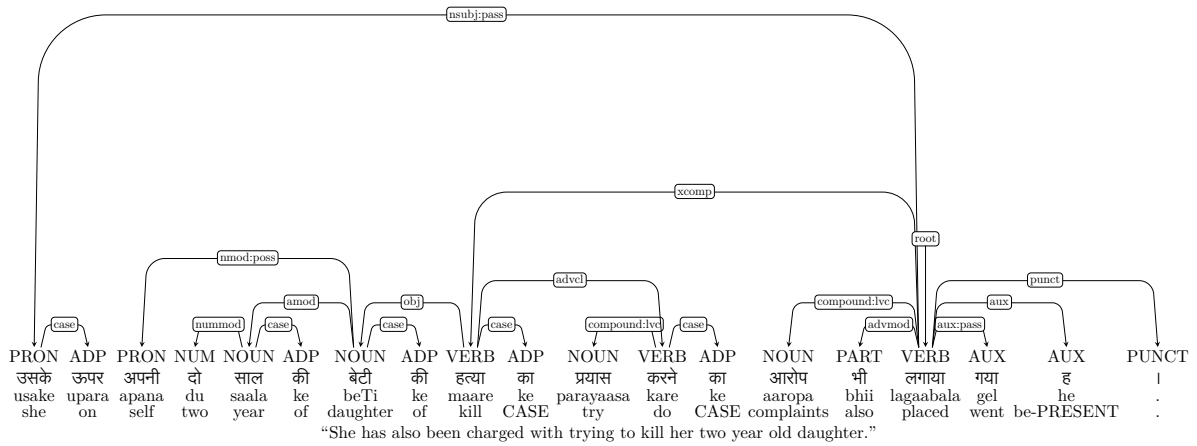


Figure 4: A parallel Magahi construction illustrating the clausal relation

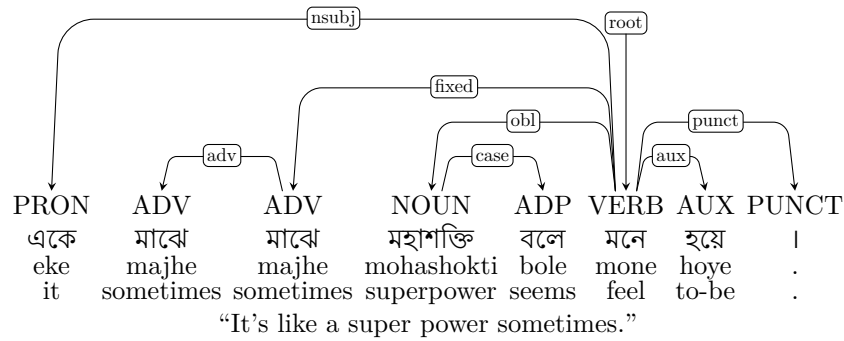


Figure 5: A parallel Bengali construction illustrating the simple verb construction.

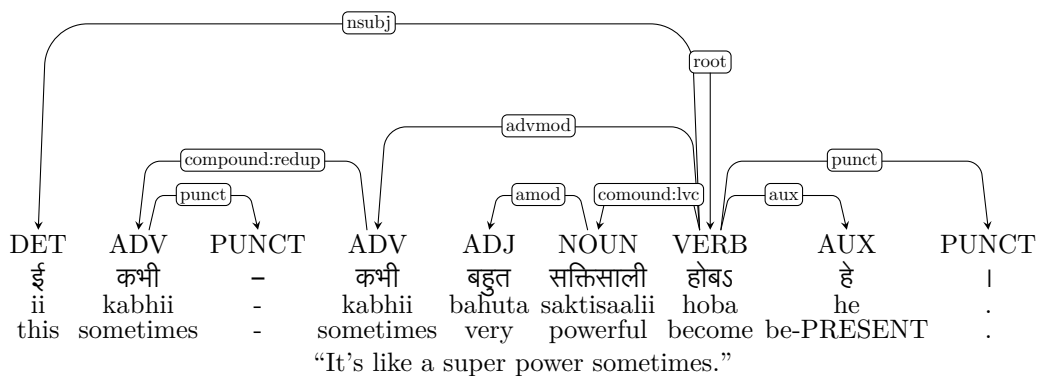


Figure 6: A parallel Magahi construction illustrating a simple verb construction

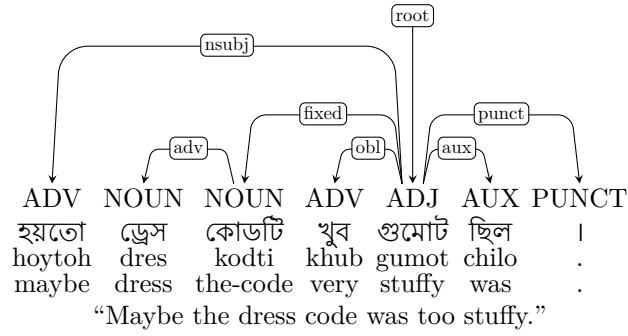


Figure 7: A parallel Bengali construction illustrating the non-verbal predicate construction.

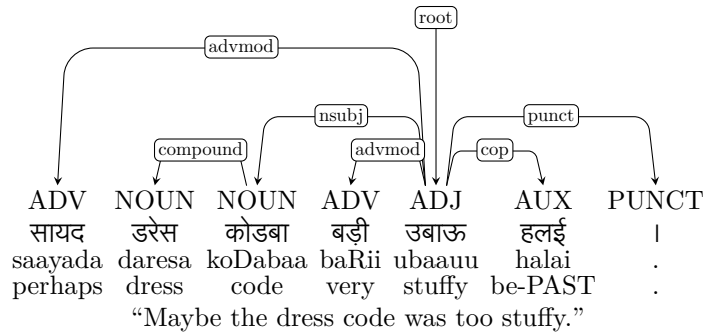


Figure 8: A parallel Magahi construction illustrating a non-verbal predicate

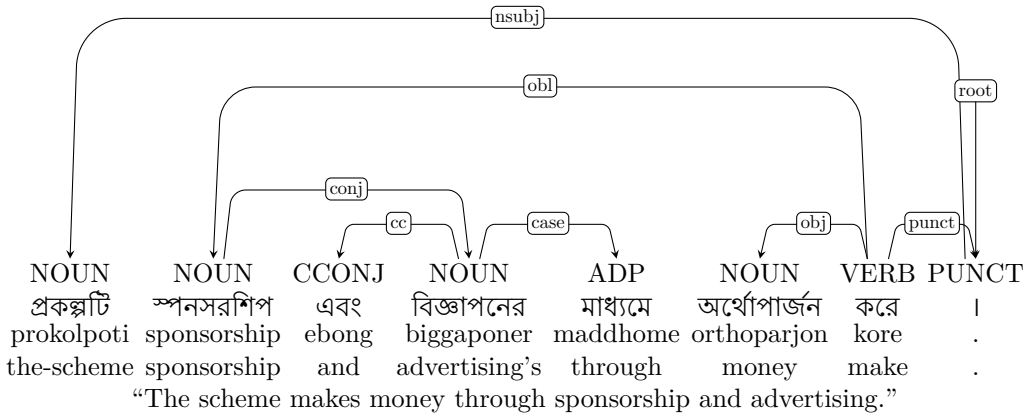


Figure 9: A parallel Bengali construction illustrating the nominal coordinating relation.

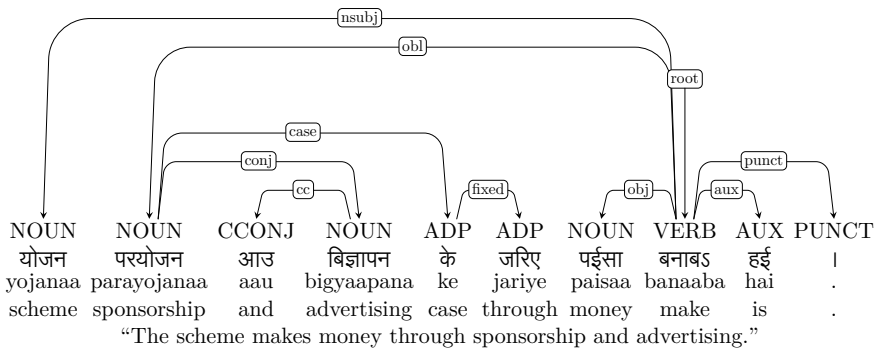


Figure 10: A parallel Magahi construction illustrating the nominal coordinating relation.