



# A CCGbank for Turkish: From Dependency to CCG

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# Introduction



- The aim of this study is to create a tool for semantic parsing (to be used in automated inquiry systems, chat-box tools, search engines).
- Dependency or tree structures do not provide one to one correspondence between syntax and semantics.
  - Information on argument structures of verbs and semantic types of lexical items is missing.
- CCG offers a categorical lexicon and a more transparent structure between syntax and semantics.
- CCGbanks have higher parsing scores than their treebank equivalents (Hockenmaier and Steedman, 2007; Bosco et al., 2000; Çakıcı, 2009; Ambati et al., 2018).
- CCG approach requires a bigger corpus for the machines to learn each lexical type.
- In this study we automatically transferred an already existing Turkish dependency corpora to a CCGbank.

# Previous Studies in CCG



- The dependency to CCG conversion studies started in 2006 by Hockenmaier for the German language.
- Other conversion studies are as follows:
  - English (Hockenmaier and Steedman, 2007),
  - Chinese (Tse and Curran, 2010),
  - Italian (Johan et al., 2009),
  - Hindi (Bhatt et al., 2009).
  - Turkish, Çakıcı (2009)
    - Çakıcı (2009) aimed a morphemic CCGbank lexicon for the first time. That is, she assigns categories to the morphological units as well as the lexical units.
    - At the time, there was only one dependency corpus present in Turkish and it was not big enough for a CCGbank. (METU Turkish Corpus (Atalay et al., 2003; Oflazer et al., 2003) contained 60k word tokens)

# CCG: Definition



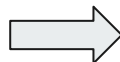
- **Combinatory Categorical Grammar (CCG) (Steedman, 2000):** a lexical grammar formalism that offers a transparent interface between syntax and semantics.

# CCG: Lexicon

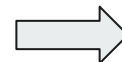
- **Combinatory Categorical Grammar (CCG) (Steedman, 2000):** a lexical grammar formalism that offers a transparent interface between syntax and semantics.
  - **The Lexicon:**



yemek-ler  
food-PL  
NP



daha  
more  
(NP/NP)/(NP/NP)



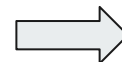
ye-di  
eat-PAST  
S



sağlıklı  
healthy  
NP/NP



ye-di  
eat-PAST  
S\NP



ye-di  
eat-PAST  
S\NP\NP<sub>[nom]</sub>

# CCG: Combining Lexical Items

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- Forward Application :  $X/Y \Rightarrow X$  applied to  $Y$  becomes  $X$
  - Backward Application :  $X \backslash Y \Rightarrow X$  applied to  $Y$  becomes  $X$
  - Forward Composition :  $(X/Y)$  combined with  $(Y/Z)$  becomes  $X/Z$
  - Backward Composition :  $(Y \backslash Z)$  combined with  $(X \backslash Y)$  becomes  $X \backslash Z$
  - Forward Type-raising :  $X$  becomes  $T/(T \backslash X)$
  - Backward Type-raising :  $X$  becomes  $T \backslash (T/X)$
- } atomic categories
- } complex categories
- } type mismatch

# The Input: Dependency Treebanks



The input we applied the CCG algorithm consists of the following dependency treebanks:

- **The Turkish Penn Treebank**
  - Consists of a total of 87,367 word tokens which are translated from the original Penn Treebank corpus.
  - The data consists of translated sentences taken from journals such as Wall Street Journal Articles.
- **FrameNet**
  - Consists of 19,221 tokens and 140 different semantic frames
- **KeNet**
  - The largest treebank of Turkish with 178,70 tokens
  - Sentences consist of example sentences taken from the Turkish National dictionary.
- **Atis**
  - A domain specific treebank that is built from the audio recordings of people inquiring for flight information from automated systems (translated from English)
  - Consists of 45,875 tokens
- **Tourism**
  - A domain specific treebank that includes written customer reviews for a booking company
  - Consists of 92,200 tokens

# The Input: Framework



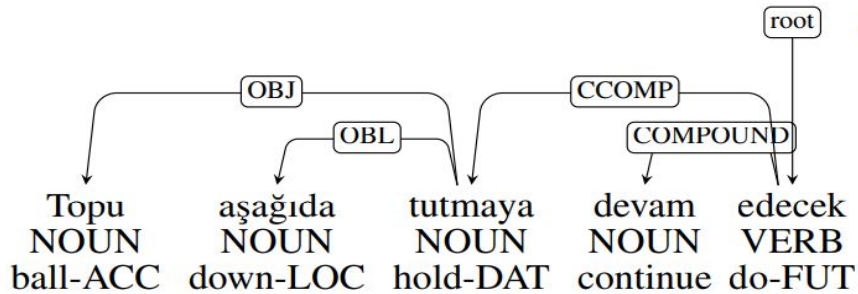
The treebanks we used were annotated under the framework provided by the **Universal Dependencies (UD)**.

- The universal dependencies aim to achieve a cross-linguistically consistent treebank annotation.
- The Universal Dependency Project pioneered to develop treebanks for languages other than English since 2013.
- There are currently 200 treebanks over 100 languages released in the project.



# “From Dependency to CCG” in a nutshell

## The dependency structure



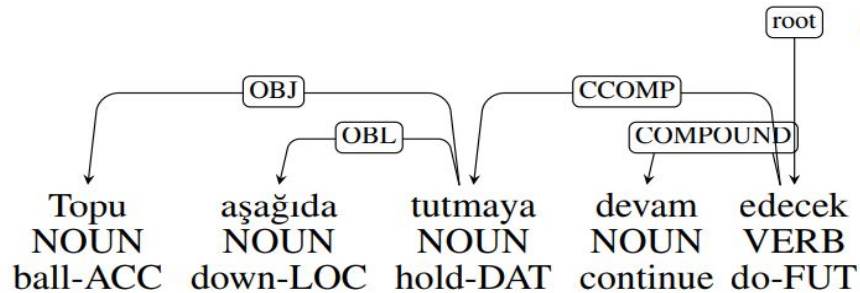
## The CCG structure

Topu	aşağıda	tutmaya	devam	edecek
NP	NP	S\NP\NP	(S\S)/(S\S)	(S\S)

"S/he will continue to hold the ball down"

# “From Dependency to CCG” in a nutshell

## The dependency structure



"S/he will continue to hold the ball down"

## The CCG structure

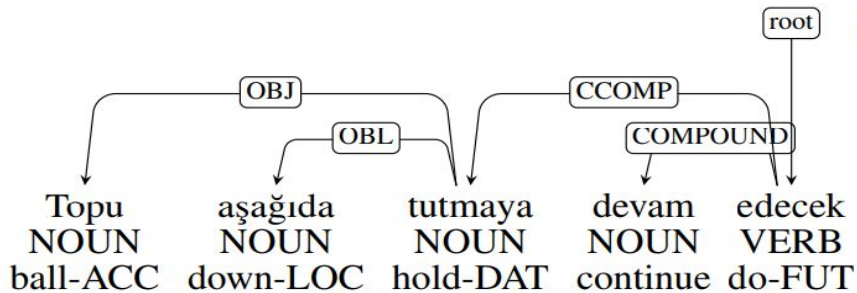
Topu    aşağıda    tutmaya    devam    edecek  
NP       NP       S\NP\NP    (S\S)/(S\S)    (S\S)

The CCG algorithm is based on:

- POS information of the word tokens,
- Head/complement relationship between the tokens,
- The dependency label between the tokens.

# The CCG Algorithm: Identifying Arguments

- First step of the algorithm is to identify the arguments of the matrix predicate.
- Arguments can be nominal or clausal.
- Nominal arguments come from the relations such as OBJ or OBL.
  - The subject NP's are marked as NP<sub>[nom]</sub>.
- Clausal arguments such as CCOMP and XCOMP are added to the lexical item as S.



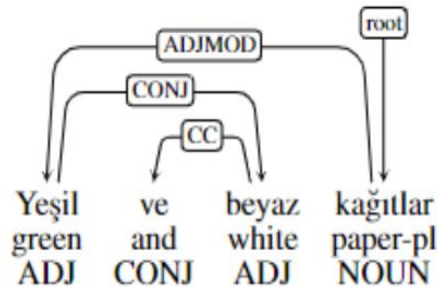
Topu    aşağıda    tutmaya    devam    edecek  
NP       NP       S\NP\NP    (S\S)/(S\S)    (S\S)

"S/he will continue to hold the ball down"

# The CCG Algorithm: Conjuncts

- Conjuncts are given the category of  $(X \setminus X) / X$  in the first iterations
- Then the variables take the category of the conjuncts (e.g.  $X = NP / NP$ )

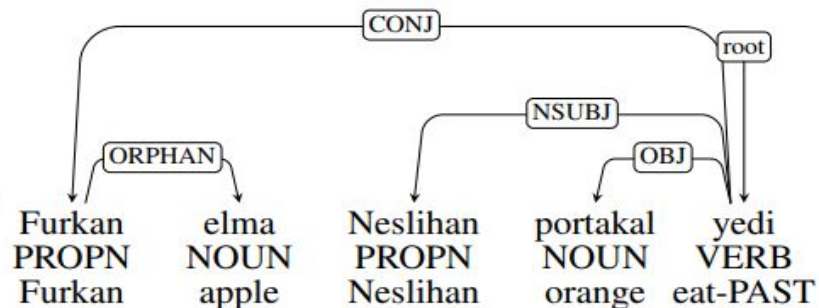
The dependency annotation:



The CCG annotation:

Yeşil	ve	beyaz	kağıtlar
Green	and	white	papers
$(NP / NP) / (NP / NP)$	$(X \setminus X) / X$	$NP / NP$	$NP$

# Ellipsis



"Neslihan ate oranges, Furkan apples."

Figure1: ellipsis of the predicate

## CCG translation:

Furkan	elma	Neslihan	portakal	yedi.
Furkan	apple	Neslihan	orange	eat-PAST
NP	NP	NP <sub>[nom]</sub>	NP	S \ NP <sub>[nom]</sub> \ NP \ NP

- The remaining argument is linked to the head of the clause with ORPHAN relation.
- ORPHAN relation signifies that “apple” is not an argument of Furkan.
- The CONJ relation adds an argument to the matrix predicate.

# Results

cat. type	freq.	pos
NP/NP	94298	ADJ
NP	55580	NOUN
S\S	51707	ADV
NP <sub>[nom]</sub>	35409	NOUN
S	25413	VERB
S \NP <sub>[nom]</sub>	24780	VERB
S/S	22686	ADV
NP <sub>[nom]</sub> / NP <sub>[nom]</sub>	18453	ADJ
S\NP <sub>[nom]</sub> / S\NP <sub>[nom]</sub>	10944	VERB
S\NP	10498	VERB
NP/NP/NP/NP	6582	ADJ
S\NP/S \NP	4627	ADV
S/NP	4083	VERB
S/S \NP	3756	VERB
(S\NP <sub>[nom]</sub> ) \NP	3350	VERB

Table: The most frequent 15 categories

- There are 630 different categories in this CCGbank with 516k words.
  - This number was around 530 in the previous CCG study in Turkish even with a corpus consist of 60k words.
- Simple/ atomic categories are more common.

# Conclusion



- In this study, we presented the process of inducing a CCGbank for Turkish from an existing dependency treebank.
- Introduced an algorithm that can be applied to all dependency treebanks in Turkish with UD annotations.
- UD annotations are updated regularly, therefore, the algorithm might need updates for the upcoming treebanks and UD releases.
- The annotation frameworks become more and more morphemic in each release, so that we expect the algorithm to become less lexicalist in the future.

# References



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