

L4: Syntax II - Encoding grammar with features

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September 17, 2015



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Previously...

We developed a (simplified) CFG fragment of English.

But structural relations are not enough.



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- ▶ *Agreement*: George/They likes/like butterflies.
- ▶ *Sub-categorisation*: Alex liked */the park.



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Sentences must have subjects: It rains.



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3. Sentence meaning:

#The tree climbed up George.



Outline

Agreement

Examples of agreeing constituents

Sub-categorisation

Verbs as predicates

Nouns as predicates

Representing constraints: features and unification

Feature structures and unification

Agreement in unification grammar

Sub-categorisation in unification grammar



Agreement

Subject-verb agreement

... in Person and Number

- (1) a. [_{NP}George] likes to travel by plane.
b. [_{NP}Cats] like to travel by plane.



Subject-verb agreement

... in Person and Number

- (1) a. [_{NP}George] **likes** to travel by plane.
b. [_{NP}Cats] **like** to travel by plane.
- (2) a. **Does** [_{NP}this cat] **like** to travel by plane?
b. **Do** [_{NP} these cats] **like** to travel by plane?



Subject-verb agreement

... in Person and Number

- (1) a. [NPGeorge] **likes** to travel by plane.
b. [NPCats] **like** to travel by plane.
- (2) a. **Does** [NPthis cat] **like** to travel by plane?
b. **Do** [NP these cats] **like** to travel by plane?
- (3) a. *[NPCats] **likes** to travel by plane.
b. ***Do** [NPGeorge] **likes** to travel by plane?



Main verb and auxiliary verb

...agree for **Tense** in English.

- (4) a. Many flights stop**ed** in Chicago.
b. Many flights **did** stop in Chicago.
c. **Did** any flights stop in Chicago?
d. **Did** George stop in Chicago?



Case

In Kambera the verb agrees with both subject and object.

(5) a.

[l Ama]_s na_s-kei-ya_o [na rí muru]_o
the father 3sg,nom-buy-3sg,acc the vegetable green
“Father buys the green vegetables.”

b.

Na_s-kei-ya_o
3sg,nom-buy-3sg,acc
“He/she buys it.”

(Tallerman, 2011), p.159



Case

English pronouns behave similarly. . .

- (6) a. She_{nom} met her_{acc}.
b. *She_{nom} met he_{nom}.
c. *Him_{acc} met she_{nom}.



Gender

Object-verb gender in Arabic

- (7) a. uhibbuka
I love you - said to a male.
- b. uhibbuki
I love you - said to a female.



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I love you - said to a female.

Subject-verb agreement in Portuguese

- (8) a. Muito obrigado.
I am very grateful - said by a male.
- b. Muito obrigada.
I'm very grateful - said by a female.



Gender

Determiner-adjective-noun agreement in German

- (9) a. der Krach
the noise
- b. der laute Krach
the loud noise
- c. ein lauter Krach
a loud noise
- d. lauter Krach
loud noise



Gender

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Interaction with Case

- (10) a. die kluge starke Frau
the clever strong woman (nom)
b. der klugen starken Frau
the clever strong woman (gen)



Quantifiers

- (11) a. Many letters have arrived.
b. *Much letters have arrived.
c. Not much post has arrived.
d. *Not many post has arrived.



Why natural languages have agreement?



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Marking grammatical relations between constituents.

From Northern Sotho, a Bantu language (Tallerman, 2011), p.160:

(12) a.

Mpša e-lomile ngwana.

dog subj-bit child

“The dog bit a/the child.”



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“The dog bit a/the child.”

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Ngwana mpša e-mo-lomile.

child dog subj-obj-bit

“As for the child, the dog bit him/her.”



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“As for the child, the dog bit him/her.”

c.

Mpša ngwana e-mo-lomile.

dog child subj-obj-bit

“As for the dog, it bit the child.”



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Encode the agreement information in CFG rules.

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(14) a. $TP \rightarrow NP_{3sg}\ T_{3sg}\ VP_{Non3sg}$

b. $TP \rightarrow NP_{Non3sg}\ T_{Non3sg}\ VP_{Non3sg}$

c. $T_{3sg} \rightarrow \text{does} \mid \text{has} \mid \dots$

d. $T_{Non3sg} \rightarrow \text{do} \mid \text{have} \mid \dots$

e. $V_{3sg} \rightarrow \text{likes} \mid \dots$

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g. $NP_{3sg} \rightarrow (D)\ (AP+)\ N_{3sg}\ (PP+)\$

h. $NP_{Non3sg} \rightarrow (D)\ (AP+)\ N_{Non3sg}\ (PP+)\$

i. $N_{3sg} \rightarrow \text{George} \mid \text{tree} \mid \text{he} \mid \text{she} \mid \text{it} \mid \dots$

j. $N_{Non3sg} \rightarrow \text{I} \mid \text{you} \mid \text{we} \mid \text{they} \mid \text{cats} \mid \text{trees} \dots$



Sub-categorisation

The categories of verbs

Currently, our VP rule is very general. . .

(15) $VP \rightarrow (AdvP+) V (NP) (\{NP/CP\}) (AdvP+) (PP+) (AdvP+)$



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(15) $VP \rightarrow (AdvP+) V (NP) (\{NP/CP\}) (AdvP+) (PP+) (AdvP+)$

But not every verb is compatible with every phrase that the rule generates.

- (16) a. *George sleeps the birds.
b. *George bought that Lydia sang an aria.



Different kinds of lexical incompatibility

- (17) a. #George typed a neutrino.
b. #The apple is eating the colourless green cat furiously.



Different kinds of lexical incompatibility

- (17) a. #George typed a neutrino.
b. #The apple is eating the colourless green cat furiously.
c. *George said.
d. *George kissed Lydia Simon.



Verbs as predicates

1. No argument

[NPlt] rains. [NPlt] snows.

Sentences have to have subjects: dummy “it”.



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[NPGeorge] fell.

Remember: sentences have to have subjects!



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[NPGeorge] fell.

Remember: sentences have to have subjects!

4. An agent and a theme argument: transitive verbs

[NPGeorge] kissed [NP Lydia] again.



5. An agent, a theme, and a goal argument

[_{NP}George] gave [_{NP}Lydia] [_{NP}a present].

[_{NP}George] gave [_{NP}a present] [_{PP}to Lydia].



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6. An agent and a proposition argument: factives

[_{NP}George] said [_{CP}that he enjoyed the opera].



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7. An agent and an event argument

[_{NP}George] intended [_{TP}to climb a tree].



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[NPGeorge] asked [NPLydia] [CPwhether she wants to. . .].



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[NPGeorge] wanted [NPLydia] [TPto sign an aria].



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[NPGeorge] asked [NPLydia] [CP_{whether} she wants to. . .].
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[NPGeorge] wanted [NPLydia] [TP_{to} sign an aria].
10. ...



Arguments are of types: Theta/ θ -roles

Thematic roles

(18) Agent, Theme, Goal...



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Sub-categorisation frame/valency: a collection of arguments/theta roles associated with a verb:

(19) give(Agent, Theme, Goal)



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Theta-hierarchy

(20) Agent < Experiencer < Goal/Source/Location < Theme

(21) a. Captain Alex sank the ship.

b. The ship sank.



Arguments are of types: Theta/ θ -roles

A single verb can have different subcat-frames:

- (22) a. George found a snake.
b. George found me a good song on iTunes.



Sub-categorisation resources for NLP

FrameNet: an annotated lexical resource of linguistic predicates (frames) and their arguments (frame elements).

<http://framenet.icsi.berkeley.edu>

<http://spraakbanken.gu.se/eng/swefn>



Communication

Core frame elements:

1. **Communicator:** He finds it hard to communicate. . .
2. **Medium:** Opinions are usually communicated over the telephone. . .
3. **Message:** How do you communicate to them that you really like them?
4. **Topic:** Had someone communicated to the capital about the disregard of the religious law?
5. **Addressee:** The company must be able to communicate to potential customers. . .
6. **Amount of information:** He never really fully communicated his intentions.
7. **Duration, frequency, manner, means, place, purpose, time.** . .



Nouns as predicates

- (23) a. [NP a student [PPof linguistics]
[PPwith long hair]].



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- (23) a. [NP a student [PPof linguistics]
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- b. *[NP a student [PPof linguistics] [PPof physics]]
- c. [NP a student [PPwith short hair] [PPwith blue top] [PPon a bike]]



Nouns as predicates

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- d. *[NP a student [PPwith short hair] [PPof linguistics]]]
- e. [NP the one [PPwith short hair]]
- f. *[NP the one [PPof linguistics]]



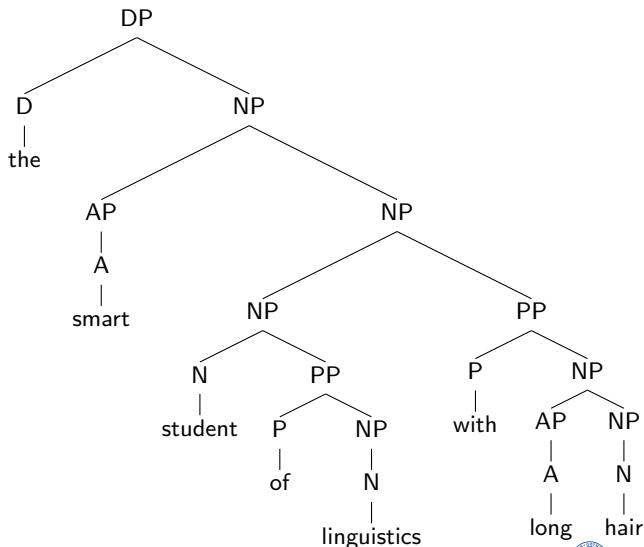
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Sub-categorisation arguments (**Complements**) are obligatory, other modifiers are optional (**Adjuncts**).



Complements and adjuncts structurally



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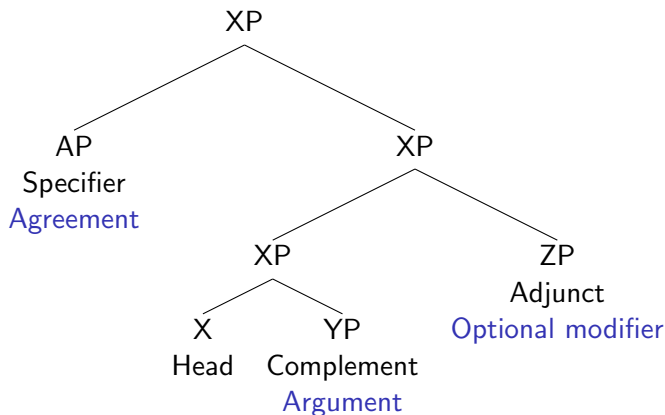
Sentences (TPs) make a similar tree.

What takes the D's place?

What takes the AP's and PP's place?



Can structural relations be generalised?



The X-bar theory

The X-bar theory (Chomsky, 1970; Jackendoff, 1977):

- (24) a. $XP \rightarrow \text{Spec}; \bar{X}$
b. $(\bar{X} \rightarrow \bar{X}; ZP)$
c. $\bar{X} \rightarrow X; YP$



Representing sub-categorisation in CFG

- ▶ A new rule for each predicate category?

1. $VP_{intran} \rightarrow NP V_{intran}$
2. $VP_{tran} \rightarrow NP V_{tran} NP$
3. ...



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 3. ...
- ▶ Doable on its own but remember there is also agreement!
- ▶ Parametrise each node in the tree with **feature structures**.



Representing constraints: features and unification

Feature structures and unification

- Represent each node of a CFG tree as a FS.



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Feature structures and unification

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(25) $S \rightarrow NP VP$

The number of the NP is equal to the number of the VP.



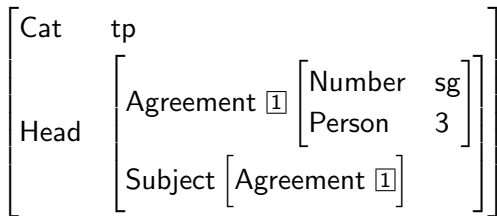
Feature structures as attribute-value matrices (AVMs)

$$\begin{bmatrix} \text{Cat} & \text{np} \\ \text{Number} & \text{sg} \\ \text{Person} & 3 \end{bmatrix} \quad \begin{bmatrix} \text{Cat} & \text{np} \\ \text{Agreement} & \begin{bmatrix} \text{Number} & \text{sg} \\ \text{Person} & 3 \end{bmatrix} \end{bmatrix}$$

- ▶ Lists of feature=value pairs
- ▶ **Features/attributes:** atoms
- ▶ **Values:** atoms or feature structures
- ▶ **Feature path:** a list of features through a FS leading to a value: $\langle \text{Agreement Person} \rangle$
- ▶ Feature paths as **directed acyclic graphs (DAGs)**.



Shared or reentrant feature structures



Unifying FSs

- **Unification (\sqcup):** combine two FSs so that the resulting FS contains all the information from the original two, nothing more.
- **Partial operation:** may be undefined (unlike union of sets).

$$\text{F1: } \begin{bmatrix} \text{Cat} & \text{np} \\ \text{Agreement} & \begin{bmatrix} \text{Number} & \text{sing} \end{bmatrix} \end{bmatrix} \quad \text{F2: } \begin{bmatrix} \text{Cat} & \text{np} \\ \text{Agreement} & \begin{bmatrix} \text{Person} & 3 \end{bmatrix} \end{bmatrix}$$

$$\text{F1} \sqcup \text{F2} =$$



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$$\text{F1} \sqcup \text{F2} = \text{F3: } \begin{bmatrix} \text{Cat} & \text{np} \\ \text{Agreement} & \begin{bmatrix} \text{Number} & \text{sing} \\ \text{Person} & 3 \end{bmatrix} \end{bmatrix}$$



Examples of unification

F4: $\left[\text{Cat} \quad \text{np} \right]$

F5: $\left[\text{Cat} \quad \text{vp} \right]$

$F4 \sqcup F5 =$



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$F4 \sqcup F5 = F6$: Undefined!

F7: $\left[\text{Cat} \quad \text{np} \right]$

F8: $\left[\text{Cat} \quad [] \right]$

$F7 \sqcup F8 =$



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F7: $\left[\text{Cat} \quad \text{np} \right]$

F8: $\left[\text{Cat} \quad [] \right]$

$F7 \sqcup F8 = F9$: $\left[\text{Cat} \quad \text{np} \right]$



Examples of unification

F4: $\left[\text{Cat} \quad \text{np} \right]$

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F8: $\left[\text{Cat} \quad [] \right]$

$F7 \sqcup F8 = F9$: $\left[\text{Cat} \quad \text{np} \right]$

F10: $[]$

$F7 \sqcup F10 =$



Examples of unification

F4: $\left[\text{Cat} \quad \text{np} \right]$

F5: $\left[\text{Cat} \quad \text{vp} \right]$

$F4 \sqcup F5 = F6$: Undefined!

F7: $\left[\text{Cat} \quad \text{np} \right]$

F8: $\left[\text{Cat} \quad [] \right]$

$F7 \sqcup F8 = F9$: $\left[\text{Cat} \quad \text{np} \right]$

F10: $[]$

$F7 \sqcup F10 = F7 = \left[\text{Cat} \quad \text{np} \right]$



Examples of unification

$$F11: \left[\begin{array}{l} \text{Agreement} \\ \text{Subject} \end{array} \left[\begin{array}{l} \left[\text{Number} \quad \text{sing} \right] \\ \left[\begin{array}{l} \text{Agreement} \\ \text{Person} \end{array} \left[\begin{array}{l} \text{Number} \quad \text{sing} \\ \text{Person} \quad 3 \end{array} \right] \end{array} \right] \right]$$

$$F12: \left[\begin{array}{l} \text{Agreement} \\ \text{Subject} \end{array} \left[\begin{array}{l} \boxed{1} \left[\text{Number} \quad \text{sing} \right] \\ \left[\text{Agreement} \quad \boxed{1} \right] \end{array} \right] \right]$$

$$F11 \sqcup F12 =$$



Examples of unification

$$F11: \begin{bmatrix} \text{Agreement} & \begin{bmatrix} \text{Number} & \text{sing} \end{bmatrix} \\ \text{Subject} & \begin{bmatrix} \text{Agreement} & \begin{bmatrix} \text{Number} & \text{sing} \\ \text{Person} & 3 \end{bmatrix} \end{bmatrix} \end{bmatrix}$$

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Agreement in unification grammar

- (26) a. George **likes** planes.
b. Cats **like** planes.



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$\langle NP \text{ Agreement} \rangle = \langle VP \text{ Agreement} \rangle$

(Jurafsky and Martin, 2009) and (Shieber, 1986)



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$\langle NP \text{ Agreement} \rangle = \langle VP \text{ Agreement} \rangle$

(Jurafsky and Martin, 2009) and (Shieber, 1986)

$S \rightarrow NP [AGR=?n] VP [AGR=?n]$

?n in FS is a **variable**!



Terminal nodes

Propagating features from terminals to heads

`V[AGR=[NUM=pl]] -> 'like'`

`V[AGR=[NUM=sg,PERS=3]] -> 'likes'`

`V[AGR=[]] -> 'liked'`



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Propagating features from terminals to heads

V[AGR=[NUM=pl]] -> 'like'

V[AGR=[NUM=sg,PERS=3]] -> 'likes'

V[AGR=[]] -> 'liked'

N[AGR=[NUM=sg]] -> 'George'

N[AGR=[NUM=pl]] -> 'planes' | 'cats'

N[AGR=[]] -> 'sheep' | 'fish'



Propagating features from heads to phrases

Head features: features of a **head** that get propagated to the phrase



Propagating features from heads to phrases

Head features: features of a **head** that get propagated to the phrase

VP [AGR=?agr] -> V [AGR=?agr] NP



Propagating features from heads to phrases

Head features: features of a **head** that get propagated to the phrase

$VP[AGR=?agr] \rightarrow V[AGR=?agr] NP$

All head features can be grouped under the head FS and then propagated with a rule like

$X[HEAD=[CAT=v, AGR=[NUM=sg, PERS=3]], \dots]$

$XP[HEAD=?head] \rightarrow \dots X[HEAD=?head] \dots$



Sub-categorisation in unification grammar

- (27) a. $[_{NP} \text{George}]$ intended $[_{TP} \text{to climb a tree}]$.
b. $[_{NP} \text{George}]$ saw $[_{NP} \text{Lydia}]$.



Sub-categorisation in unification grammar

- (27) a. $[_{NP}George]$ intended $[_{TP}to\ climb\ a\ tree]$.
b. $[_{NP}George]$ saw $[_{NP}Lydia]$.

Add a subcat feature to predicates in the lexicon.

$V[HEAD=[...],SUBCAT=to_clause] \rightarrow intended$

$V[HEAD=[...],SUBCAT=trans] \rightarrow saw$



Sub-categorisation in unification grammar

- (27) a. $[_{NP} \text{George}]$ intended $[_{TP} \text{to climb a tree}]$.
b. $[_{NP} \text{George}]$ saw $[_{NP} \text{Lydia}]$.

Add a subcat feature to predicates in the lexicon.

$V[\text{HEAD}=[\dots], \text{SUBCAT}=\text{to_clause}] \rightarrow \text{intended}$

$V[\text{HEAD}=[\dots], \text{SUBCAT}=\text{trans}] \rightarrow \text{saw}$

$VP[\text{HEAD}=?\text{head}, \text{SUBCAT}=\text{trans}] \rightarrow$

$V[\text{HEAD}=?\text{head}, \text{SUBCAT}=\text{trans}] \text{ NP}$

$VP[\text{HEAD}=?\text{head}, \text{SUBCAT}=\text{to_clause}] \rightarrow$

$V[\text{HEAD}=?\text{head}, \text{SUBCAT}=\text{to_clause}] \text{ TP}[-\text{TENSE}]$



More examples in NLTK

`nltk_data/grammars/book_grammars/
feat0.fcfg, feat1.fcfg and german.fcfg`



Further reading

- ▶ (Allen, 1995): Chapters 4.1 (Feature systems and augmented grammars), 4.2 (Some basic feature systems for English) and 4.3 (A simple grammar using features)
- ▶ (Bird, Klein, and Loper, 2009): [Chapter 9](#) Building Feature Based Grammars.
- ▶ (Jurafsky and Martin, 2009): Chapter 15.1 (Feature Structures), 15.2 (Unification feature structures), 15.3 (Feature structures in the grammar) and 15.4 (Implementation of Unification)
- ▶ (Shieber, 1986): <http://dash.harvard.edu/handle/1/11576719>



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Jurafsky, Dan and James H. Martin. 2009. *Speech and language processing: an introduction to natural language processing, computational linguistics, and speech recognition*. Pearson Prentice Hall, Upper Saddle River, N.J., 2nd ed edition.



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