

Syntactic Formalisms for Parsing Natural Languages

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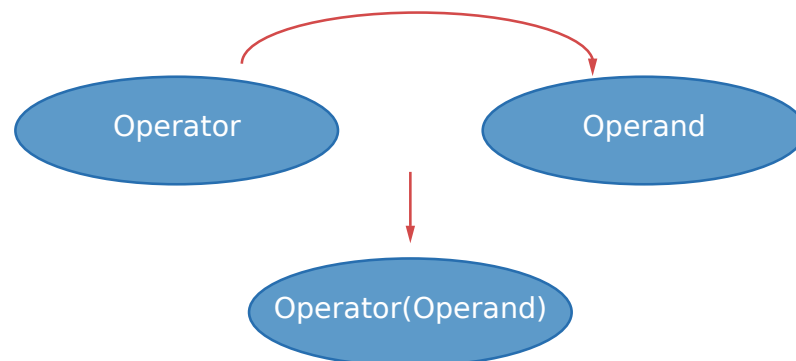
Outline

- Applicative system
- Combinators
- Combinators vs. λ -expressions
- Application to natural language parsing
- Combinators used in CCG

Applicative system

- CL (Curry & Feys, 1958, 1972) as an applicative system

CL is an applicative system because the basic unique operation in CL is the application of an operator to an operand



Combinators

CL defines general operators, called Combinators.

- Each combinator composes between them the elementary combinators and defines the complex combinators.
- Certain combinators are considered as the basic combinators to define the other combinators.

Elementary combinators

I	$=_{\text{def}} \lambda x.x$	(<i>identifier</i>)
K	$=_{\text{def}} \lambda x.\lambda y.x$	(<i>cancellator</i>)
W	$=_{\text{def}} \lambda x.\lambda y.xyy$	(<i>duplicator</i>)
C	$=_{\text{def}} \lambda x.\lambda y.\lambda z.xzy$	(<i>permutator</i>)
B	$=_{\text{def}} \lambda x.\lambda y.\lambda z.x(yz)$	(<i>compositor</i>)
S	$=_{\text{def}} \lambda x.\lambda y.\lambda z.xz(yz)$	(<i>substitution</i>)
Φ	$=_{\text{def}} \lambda x.\lambda y.\lambda z.\lambda u.x(yu)(zu)$	(<i>distribution</i>)
Ψ	$=_{\text{def}} \lambda x.\lambda y.\lambda z.\lambda u.x(yz)(yu)$	(<i>distribution</i>)

 β -reductions

The combinators are associated with the β -reductions in a canonical form:

β -reduction relation between X and Y

$$X \geq_{\beta} Y$$

Y was obtained from X by a β -reduction

 β -reductions

Ix	\geq_{β}	x
Kxy	\geq_{β}	x
Wxy	\geq_{β}	xyy
$Cxyz$	\geq_{β}	xzy
$Bxyz$	\geq_{β}	$x(yz)$
$Sxyz$	\geq_{β}	$xz(yz)$
$\Phi xyzu$	\geq_{β}	$x(yu)(zu)$
$\Psi xyzu$	\geq_{β}	$x(yz)(yu)$

Each combinator is an operator which has a certain number of arguments (operands); sequences of the arguments which follow the combinator are called "the scope of combinator".

 β -reductions

Intuitive interpretations of the elementary combinators are given by the associated β -reductions.

- The combinator I expresses the identity.
- The combinator K expresses the constant function.
- The combinator W expresses the diagonalisation or the duplication of an argument.
- The combinator C expresses the conversion, that is, the permutation of two arguments of a binary operator.
- The combinator B expresses the functional composition of two operators.
- The combinator S expresses the functional composition and the duplication of argument.
- The combinator Φ expresses the composition in parallel of operators acting on the common data.
- The combinator Ψ expresses the composition by distribution.

Introduction and elimination rules of combinators

Introduction and elimination rules of combinators can be presented in the style of Gentzen (*natural deduction*).

Elim. Rules	Intro. Rules
$\frac{}{f} \quad [e-I]$	f
$\frac{}{Kfx} \quad [e-K]$	$\frac{}{f} \quad [i-I]$
$\frac{}{f} \quad [e-I]$	$\frac{}{f} \quad [i-I]$
$\frac{}{f} \quad [e-I]$	$\frac{}{f} \quad [i-I]$

Introduction and elimination rules of combinators

Elim. Rules

$$\frac{}{xf} \quad [e-C]$$

$$\frac{}{f(xy)} \quad [e-B]$$

$$\frac{}{f(xz)(yz)} \quad [e-\Phi]$$

Intro. Rules

$$xf$$

$$f(xy)$$

$$f(xz)(yz)$$
Combinators vs. λ -expressions

The most important difference between the CL and λ -calculus is the use of the bounded variables.

Every combinator is an λ -expression.

$$\mathbf{B}fg \equiv \lambda x.f(gx)$$

$$\mathbf{T}x \equiv \lambda f.fx$$

$$\mathbf{S}fg \equiv \lambda x.fx(gx)$$

Application to natural language parsing

John is brilliant

- The predicate *is brilliant* is an operator which operate on the operand John to construct the final proposition.
- The applicative representation associated to this analysis is the following:

(is-brillant)John

- We define the operator **John*** as being constructed from the lexicon *John* by

[John* = C* John].

- 1 John* (is-brillant)
- 2 [John* = C* John]
- 3 C*John (is-brillant)
- 4 is-brillant (John)

Application to natural language parsing

John is brilliant in λ -term

Operator John* by λ -expression

$$[\text{John}^* = \lambda x.x (\text{John}')]]$$

- 1 John*($\lambda x.\text{is-brilliant}'(x)$)
- 2 [John* = $\lambda x.x (\text{John}')$]
- 3 ($\lambda x.x(\text{John}')$)($\lambda x.\text{is-brilliant}'(x)$)
- 4 ($\lambda x.\text{is-brilliant}'(x)$)(John')
- 5 is-brilliant'(John')

Passivisation

Consider the following sentences

- a. The man has been killed.
- b. One has killed him.

→ Invariant of meaning

→ Relation between two sentences

- :a. unary passive predicate (*has-been-killed*)
 :b. active transitive predicate (*have-killed*)

Definition of the operator of passivisation 'PASS'

$$[\text{PASS} = \mathbf{B} \sum \mathbf{C} = \sum \circ \mathbf{C}]$$

where B and C are the combinator of composition and of conversion and where \sum is the existential quantifier which, by applying to a binary predicate, transforms it into the unary predicate.

Definition of the operator of passivisation 'PASS'

$$[\text{PASS} = \mathbf{B} \sum \mathbf{C} = \sum \circ \mathbf{C}]$$

- | | | |
|-----|--|----------------------------------|
| 1/ | has-been-killed (the-man) | <i>hypothesis</i> |
| 2/ | [has-been-killed=PASS(has killed)] | <i>passive lexical predicate</i> |
| 3/ | PASS (has-killed)(the-man) | <i>repl.2.,1.</i> |
| 4/ | [PASS = B \sum C] | <i>definition of 'PASS'</i> |
| 5/ | B \sum C (has-killed)(the-man) | <i>repl.4.,3.</i> |
| 6/ | \sum (C (has-killed))(the-man) | [e- B] |
| 7/ | (C (has-killed)) x (the-man) | [e- \sum] |
| 8/ | (has-killed)(the-main) x | [e- C] |
| 9/ | [x in the agentive subject position = one] | <i>definition of 'one'</i> |
| 10/ | (has-killed)(the-man)one | <i>repl.9.,8., normal form</i> |

Definition of the operator of passivisation 'PASS'

We establish the paraphrastic relation between the passive sentence with expressed agent and its active counterpart:

The man has been killed by the enemy



The enemy has killed the man

Definition of the operator of passivisation 'PASS'

Relation between give-to and receive-from

z gives y to x



x receives y from z

The lexical predicate "give-to" has a predicate converse associated to "receive-from";

[receive-from z y x = give-to x y z]

Definition of the operator of passivisation 'PASS'

- 1/ **(receive-from) z y x**
- 2/ **C((receive-from) z) x y**
- 3/ **BC(receive-from) z x y**
- 4/ **C(BC(receive-from)) z x y**
- 5/ **C(C(BC(receive-from)) x) y z**
- 6/ **BC(C(BC(receive-from))) x y z**
- 7/ [give-to=**BC(C(BC(receive-from)))**]
- 8/ **give-to x y z**

Combinators used in CCG

Motivation of applying the combinators to natural language parsing

- Linguistic: complex phenomena of natural language applicable to the various languages
- Informatics: left to right parsing (LR)
ex: reduce the spurious-ambiguity

Parsing a sentence in CCG

Step 1: tokenization

Step 2: tagging the concatenated lexicon

Step 3: calculate on types attributed to the concatenated lexicons by applying the adequate combinatorial rules

Step 4: eliminate the applied combinators (we will see how to do on next week)

Step 5: finding the parsing results presented in the form of an operator/operand structure (predicate -argument structure)

Parsing a sentence in CCG

Example: *I requested and would prefer musicals*

STEP 1 : tokenization/lemmatization → ex) POS Tagger, tokenizer, lemmatizer

- I-requested-and-would-prefer-musicals*
- I-request-ed-and-would-prefer-musical-s*

STEP 2 : tagging the concatenated expressions → ex) Supertagger, Inventory of typed words

<i>I</i>	<i>NP</i>
<i>Requested</i>	<i>(S\NP)/NP</i>
<i>And</i>	<i>CONJ</i>
<i>Would</i>	<i>(S\NP)/VP</i>
<i>Prefer</i>	<i>VP/NP</i>
<i>musicals</i>	<i>NP</i>

Parsing a sentence in CCG

STEP 3 : categorial calculus

- apply the type-raising rules \longrightarrow *Subject Type-raising* ($> T$)
 $NP : a \Rightarrow T/(T\backslash NP) : Ta$
- apply the functional composition rules \longrightarrow *Forward Composition*: ($> B$)
 $X/Y : f \quad Y/Z : g \Rightarrow X/Z : Bfg$
- apply the coordination rules \longrightarrow *Coordination*: ($< \& >$)
 $X \text{ conj } Y \Rightarrow X$

	<i>I-</i>	<i>requested-</i>	<i>and-</i>	<i>would-</i>	<i>prefer-</i>	<i>musicals</i>	
1/	NP	$(S\backslash NP)/NP$	$CONJ$	$(S\backslash NP)/VP$	VP/NP	NP	
2/	$S/(S\backslash NP)$	$(S\backslash NP)/NP$	$CONJ$	$(S\backslash NP)/VP$	VP/NP	NP	($>T$)
3/	$S/(S\backslash NP)$	$(S\backslash NP)/NP$	$CONJ$	$(S\backslash NP)/NP$		NP	($>B$)
4/	$S/(S\backslash NP)$	$(S\backslash NP)/NP$				NP	($> \Phi$)
5/	$S/(S\backslash NP)$	$(S\backslash NP)/NP$				NP	($>B$)
6/	S/NP					NP	($>$)
7/						S	

Parsing a sentence in CCG

STEP 4 : semantic representation (predicate-argument structure)

	<i>I</i>	<i>requested</i>	<i>and</i>	<i>would</i>	<i>prefer</i>	<i>musicals</i>
1/	i'	$:request'$	$:and'$	$:will'$	$:prefer'$	$:musicals'$
2/	$\lambda x.f.i'$					
3/				$\lambda x.\lambda y.will'(prefer'x)y$		
4/			$\lambda x\lambda y.and'(will'(prefer'x)y)(request'xy)$			
5/		$\lambda x\lambda y.and'(will'(prefer'x)y)(request'xy)$				
6/		$\lambda y.and'(would'(prefer' musicals'y)(request' musicals' y)$				
7/S:	$and'(will'(prefer' musicals' i')(request' musicals' i')$					

Semantic representation in term of the combinators

I-	requested	and-	would-	prefer	musicals
1/ NP	(S\NP)/NP	CONJ	(S\NP)/VP	VP/NP	NP
2/ S/(S\NP)	(S\NP)/NP	CONJ	(S\NP)/VP	VP/NP	NP (>T)
C*I	requested	and	would	prefer	musicals
3/ S/(S\NP)	(S\NP)/NP	CONJ	(S\NP)/NP	NP	(>B)
C*I	requested	and	B would prefer	musicals	
4/ S/(S\NP)	(S\NP)/NP			NP	(>Φ)
C*I	Φ and requested (B would prefer)			musicals	
5/ S/NP			NP		(>B)
B((C*I)(Φ and requested (B would prefer)))	musicals				
6/ S					(>)
B((C*I)(Φ and requested (B would prefer)))	musicals				

Semantic representation in term of the combinators

I requested and would prefer musicals

S: **B((C*I)(Φ and requested (B would prefer))) musicals**

1/ **B((C*I)(Φ and requested (B would prefer))) musicals**

2/ **(C*I)((Φ and requested (B would prefer))) musicals** [e-B]

3/ **((Φ and requested (B would prefer))) musicals** I [e-C*]

4/ **(and (requested musicals) ((B would prefer) musicals))** I [e-Φ]

5/ **((and (requested musicals) (would (prefer musicals))))** I) [e-B]

Normal form

A normal form is a combinatory expression which is irreducible in the sense that it contain any occurrence of a redex.

If a combinatory expression X reduce to a combinatory expression N which is in normal form, so N is called the normal form of X.

Example

Bxyz is reducible to x(yz).

x(yz) is a normal form of the combinatory expression **B**xyz.

Normal form

Example

Prove xyz is the normal form of **BBC**xyz.

BBCxyz \rightarrow_{β} xyz

1/ **BBC**xyz

2/ **C(Cx)yz** [e-B]

3/ **Cxzy** [e-C]

4/ xyz [e-C]

Classwork

Give the semantic representation in term of combinators.
Please refer to the given paper on last lecture on CCG Parsing.