# SEMANTIC EXPRESSIVE CAPACITY WITH BOUNDED MEMORY

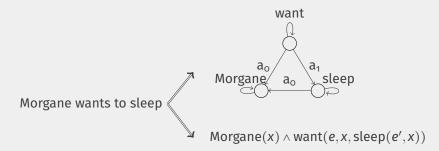
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JOINT WORK WITH ALEXANDER KOLLER

Linguistic expression  $\Rightarrow$  (formal) meaning representation. Representations can be logical formulae, or graphs (AMR [Banarescu & all 2013], MRS [Copestake & all 2005]).



 Consensual approach: semantic interpretation is a compositional process, guided by syntax.

#### Statement

"The meaning of a complex expression is a **function** of the meaning of its parts and the **syntactic rule** that combines them."

#### **Requires:**

- A syntax tree, along which semantic construction is performed in a bottom-up fashion.
- Operators for semantic composition (semantic algebra).
- Which semantic interpretation functions can we express compositionally using specific classes of syntax trees and semantic operators?

## (Essentially) one job:

### combine predicates with their arguments.



## 'Unification style'

**Finite** set of markers denoting 'holes' ((s), (o), (mod), (comp)) waiting to be filled with semantic values. Markers accessible in unconstrained order [Copestake & all, 2001, Courcelles & Englefriet 2012, Groshwitz & all 2017].

## 'Lambda style'

**Countably infinite** ordered set of markers but order constrain access (variables' scope) [Montague 1977, Steedman 2001].

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→ number of 'holes' accessible at a given time of the construction process is bounded: 'bounded memory'.

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# QUESTION

#### 'bounded memory' operators are popular

- In semantic parsing [Chiang & all 2013, Groschwitz & all 2018, Chen & all 2018].
- For the manual design of grammars [Bender 2002 *inter alia*].

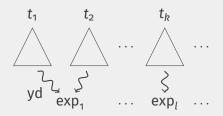
### Expressive limitation due to bounded memory capacity?

- Specifically, considering long distance dependencies.
- If impossible (from distance) to combine a predicate with its argument right away → need to store argument slot until argument becomes available.

- A lot is known on expressive capacity of grammatical formalisms – in terms of languages (of words/trees).
  - e.g., famous CCG/TAG/LIG [Vijay-Shanker & Weir, 1994] weak equivalence result.
- What about the joint expressivity of grammatical formalisms and specific semantic combinators in terms of *relations*?
- Do (weakly) equivalent grammatical formalisms support the same compositional interpretations?
- Inform the elaboration of semantic parsing systems

## ABSTRACT VIEW ON GRAMMARS

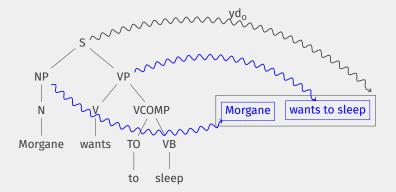
- Set of 'grammatical' syntax trees  $\{t_1, t_2, ...\}$ .
- yield function, yd, associating each tree with its string projection (the linguistic expression for which it is a grammatical analysis).



■ The set {*t*<sub>1</sub>, *t*<sub>2</sub>,...} could be given by any kind of descriptive/computing device (formal grammar, neural net,...).

# The projective yield $yd_o$

Concatenates children's yield from left to right.



# A NON-PROJECTIVE YIELD: yd<sub>w</sub>

## Swiss-German cross-serial dependencies [Shieber 1985]

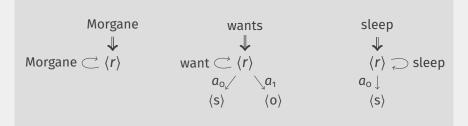


(dass) (mer) d' chind em Hans es huus lönd (that) (we) the-children-ACC Hans-DAT the-house-ACC let hälfed aastriiche help paint

'(that we) let the children help Hans paint the house'

# SEMANTIC COMPOSITION 1/3

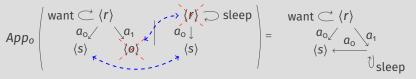
## Interpretation for elementary syntactic constituants



- $\langle s \rangle$ ,  $\langle o \rangle$ ,  $\langle r \rangle$ : markers.
- ⟨s⟩, ⟨o⟩: argument placeholders ('holes'): a semantic value will eventually be substituted for them during the process of semantic composition.
- ⟨*r*⟩: root of the semantic constituant ('hook'), destined to be substituted for an argument placeholder.

## Semantic algebra (i.e. composition operators)

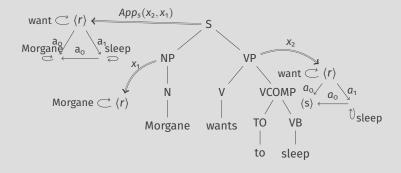
Example with the AM algebra [Groschwitz & all 2017]



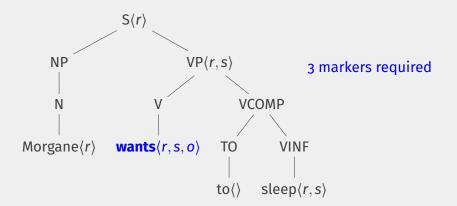
- Merge referenced marker (o) of the fonctor with the root (r) of the argument, then 'forgets' these two markers.
- Merge any other identical marker (here,  $\langle s \rangle$ ).

## Homomorphic interpretation of syntax trees

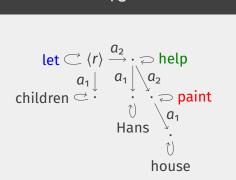
 $\{VP(x_1, x_2) \rightarrow APP_o(x_1, x_2), S(x_1, x_2) \rightarrow APP_s(x_2, x_1)\}$ 



# 'SEMANTIC' MEMORY



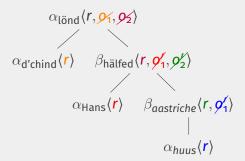
# PROJECTIVITY AND MEMORY 1/3



d'chind em Hans es huss lönd hälfed aastriche

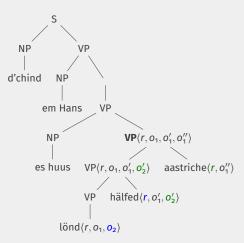
- lönd:  $\langle r, o_1, o_2 \rangle$  (two objects).
- hälfed:  $(r, o_1, o_2)$  (two objects).
- **aastriche:**  $\langle r, o_1 \rangle$  (one object).

#### Non-projective analysis possible with a 3-markers capacity.



# PROJECTIVITÉ AND MEMORY 3/3

With a projective analysis: 4 markers seem intuitively required.



## ABSTRACTING AWAY

- Arbitrary long crossed-serial dependencies → infinite memory required?
- A formal relation for a mathematical proof:

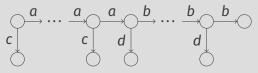
#### CSD

Word to graph function  $w \mapsto g_w$  where

• Words w are of the form:  $a \dots a b \dots b c \dots c d \dots d$ .

n times m times n times m times

• And for each such  $w, g_w$  is:



## **UNNATURAL CONSTRUCTIONS**

### Theorem ?

There exists no projective grammar and finite memory compositional interpretation mechanism over a projective grammar which expresses CSD.

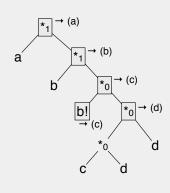
## **NOT A** Theorem

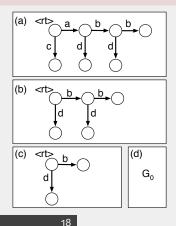
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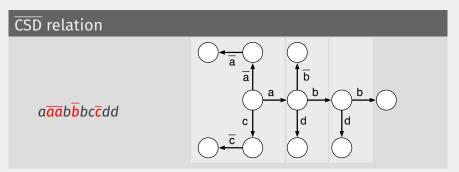
If one further impose specific alignements between elementary syntactic and semantic constituants ('a' aligned with '.\_a,', 'b' aligned with '.\_b,'...) it can be shown:

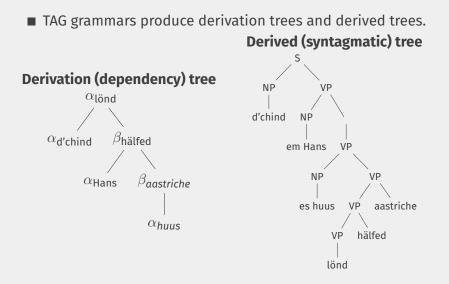
#### Theorem

- there exists no projective grammar and finite memory compositional interpretation mechanism over a projective grammar expressing CSD and respecting elementary alignments.
- There exists a non-projective grammar and a finite-memory compositional interpretation mechanism expressing CSD and respecting elementary alignments.
- Remark: strong assumption on alignments but no assumption on grammatical formalism.

## **IMPERFECT ALIGMENTS**

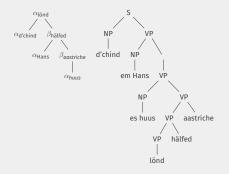
- Whithout the alignment condition the theorem is false.
- However, weaker form of alignments can be achieved if we constrain the grammatical formalism (pumping lemma).
- Requires arbitrary complex 'arguments' to avoid previous unnatural constructions.
- Result for Tree-Adjoining Grammars (TAG).





# Two (weakly) equivalent grammar formalisms

- Formalism TAG: Use the **derivation trees** of some TAG grammar with a **non-projective** yield.
- Formalism PTAG: Use the **derived trees** of some TAG grammar wutg the **projective** yield.
- The two formalisms generate the same word langages, but not necessarily the same relations.



## SECOND RESULT

#### Theorem

- There exists a (non-projective) TAG grammar and a finite memory compositional interpretation mechanism expressing CSD.
- There exists no (projective) PTAG grammar and finite memory compositional interpretation mechanism expressing CSD.

- Theoretical result on the link between compositionality, projectivity and bounded memory capacity.
- Strong result, under strong assumption of perfect syntax/semantics alignments at the lexical level.
- independent of considered grammatical formalism.
- New light shed on the choice between derivation/derived tree as the support of semantic composition for TAG grammars.
- Do weakly equivalent grammatical formalisms support the same compositional interpretation mechanisms? → **No!**.

## **CONCLUSIONS AND FUTURE WORK**

- Notion of expressivity at the syntax/semantics interface.
- Theoretical study on the link between projectivity and 'semantic' memory.
- What could we say about more restricted forms of non-projectivity? Finite increase in required memory capacity?
- Artificial non-projectivity due to imperfect aligners in semantic parsing systems.
- Locally translate from 'unification style' to 'lambda style' to circumvent projectivity issues?

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# **Questions?**