

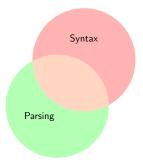
# Capturing Online SRC/ORC Effort with Memory Measures from a Minimalist Parser

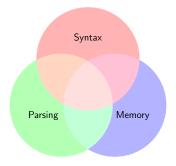
Aniello De Santo he/him

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CMCL 2025







- Do structure building operations predict behavioral results?
- 2 How do structure building/memory metrics fare wrt expectation based ones?

#### Forward to the Past

## (How much) does grammatical structure matter in sentence processing?

A realistic grammar should [...] contribute to the explanation of linguistic behavior and to our larger understanding of the human faculty of language.

(Bresnan 1978: pg. 58)

#### Derivational Theory of Complexity (Miller and Chomsky, 1963)

- ▶ Processing complexity ~ length of a derivation (Fodor & Garrett 1967; Berwick & Weinberg 1983)
- Essentially: there is a cost to mental computations.
- ▶ What is the right notion of syntactic derivation?
- ▶ What is costly? And why?

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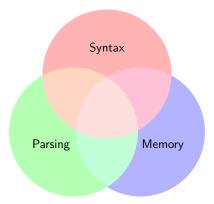
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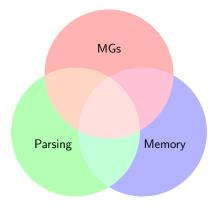
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- An explicit syntactic theory → Minimalist grammars (MGs)
- f 2 A theory of how structures are built o top-down parser



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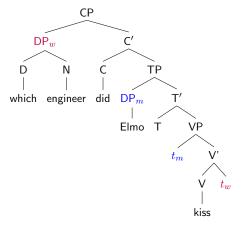
### Outline

1 Parsing Minimalist Grammars

2 A Case Study: SRC vs ORC

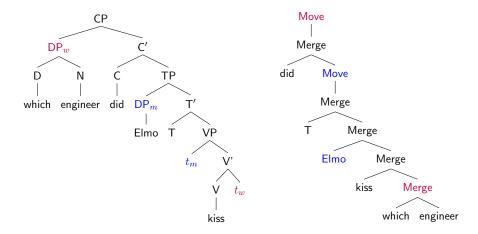
3 Results

### Minimalist Grammars (MGs) & Derivation Trees



#### Phrase Structure Tree

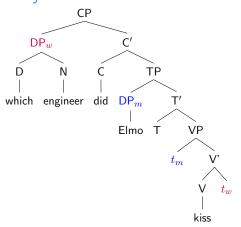
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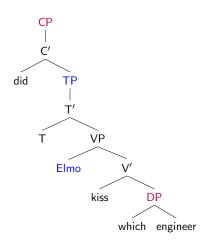


Phrase Structure Tree

**Derivation Tree** 

### MG Syntax: Derivation Trees





Phrase Structure Tree

**Derivation Tree** 

CP

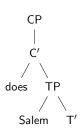
- ▶ Builds the structure from top to bottom
- ► Takes elements in an out of memory
- ightharpoonup Complexity of the structure  $\approx$  how much memory is used!

CP | C'

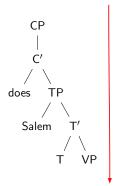
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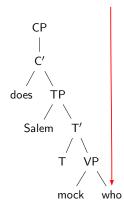
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#### Technical details!

```
who does Salem To mock

step 1 CP is conjectured

step 2 CP expands to C'

step 3 C' expands to does and TP

step 4 TP expands to Salem and T'

step 5 T' expands to T and VP

step 6 VP expands to mock and who

step 7 who is found

step 8 does is found

step 9 Salem is found

step 10 T is found
```

#### Technical details!

► String-driven recursive descent parser (Stabler 2013)

<sup>1</sup>CP

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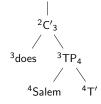


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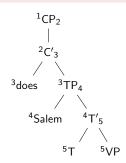


1CP2

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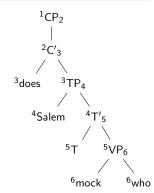
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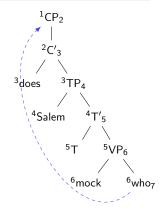
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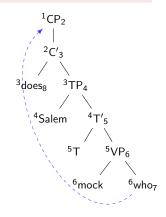
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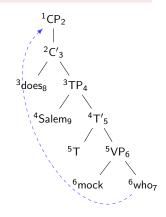
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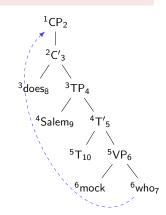


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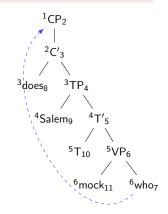
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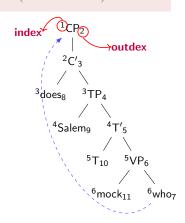
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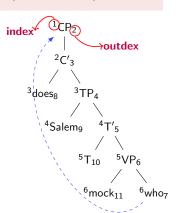


## Incremental Top-Down Parsing

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        who is found
step 7
       does is found
step 8
step 9
       Salem is found
step 10
       T is found
step 11
        mock is found
```



Index and Outdex are our connection to memory!

## Measuring Memory Usage

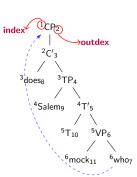
► Memory usage: (Kobele et al. 2012; Gibson, 1998)

Tenure How long a node is kept in memory

	Who	does	Salem	mock
Tenure	1	5	5	5

► Formalized into offline complexity metrics (Graf et a. 2017; De Santo 2020, 2021; a.o.

MaxT  $max(\{tenure-of(n)|n \text{ a node of the tree}\})$ 



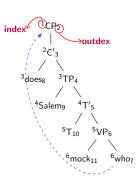
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## Processing Asymmetries All the Way Down

#### A variety of offline processing insights!

#### **Across Many Constructions**

- ► Right > center embedding (Kobele et al. 2012)
- ► Crossing > nested dependencies (Kobele et al. 2012)
- ► SRC > ORC (Graf et al. 2017; De Santo 2020; Fiorini, Chang, De Santo 2023)
- Priming/Stacked RCs (De Santo 2020, 2022)
- Postverbal subjects
   (De Santo 2019, 2021; Del Valle & De Santo 2023)
- ▶ Persian attachment ambiguities (De Santo & Shafiei 2019)
- RC attachment preferences
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#### **Across Languages**

- English, German, Italian, French, Spanish
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## A Case Study: English SRC vs ORC

(1) The horse that has chased the lions SRC

(2) The horse that the lions have chased **ORC** 

#### SRC > ORC

- ► Well-attested cross-linguistically (Lau & Tanaka 2021)
- ... with some possible exceptions (Mandarin?)

#### Possible Accounts?

- Working-memory
   (Warren & Gibson 2008; Lewis & Vasishth, 2005; a.o.)
   ⇒ BUT: Nakamura & Miyamoto 2(013) Cf. Graf et al (2017)
- ► Expectation-based accounts
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## Modeling Assumptions

#### Data

- SAP Benchmark (Huang et al. 2024)
  - self-paced reading
  - 2000 participants
  - SRC/ORC RTs
  - ▶ 24 RC sets

#### Reminder: Model Details

- Parsing strategy
  - $\Rightarrow$  Top-down parser
- Linking Hypothesis
  - ⇒ Processing Cost :: (word-by-word) Tenure

#### Degrees of freedom: Syntactic analyses

► RC constructions → (Kayne 1994)

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$$\begin{split} RT \sim WordPosition(i) + logfreq(i) * length(i) \\ + logfreq(i-1) * length(i-1) + logfreq(i-1) * length(i-2) \\ + (1|participant) + (1|item) \end{split}$$

	df	AIC	BIC
Baseline	14	977122.5	977250.8

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Baseline	14	977122.5	977250.8
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+ GPT-2 Small Surprisal	19	976301.9	976475.9
+ Tenure	19	974413.7	974587.7

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## Results: Best Fitting Model

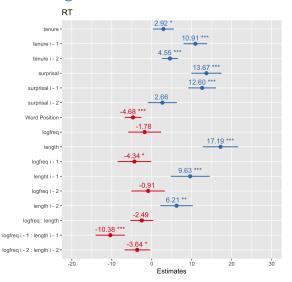


Figure: Estimates of coefficients for GTP Surprisal + Tenure.

#### Conclusion

#### TL;DR

MG-based Tenure is a good predictor of RTs.

- ► Support for MGs + Tenure beyond offline measures!
- Bridge generative syntax/sentence processing!
- Next: cross-linguistic online data, Tenure and empty heads...

#### The tip of the iceberg

- Structure- vs. expectation-based predictors!
   (Demberg & Keller 2008; Brennan et al., 2016; Stanojevic et al., 2023; Ozaki et al. 2024)
- ▶ Deeper exploration of computational linking theories (Futrell et al., 2020; Chen and Hale, 2021; Oh et al., 2022; Arehalli et al., 2022; Kajikawa et al. 2024)
- Cross-formalism comparisons
- And much more!

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# Thank you!



**Appendix** 

## Minimalist Grammars (MGs)

#### We need an explicit model of syntactic structures...



**Ed Stabler** 

Minimalist grammars (MGs): a formalization of Chomskyan syntax (Chomsky 1995; Stabler 1997)

#### Technical details!

- Weakly equivalent to MCFGs
- Essentially: CFGs with a more complicated mapping from trees to strings
- REG tree language!

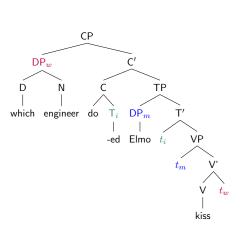
## Why MGs?

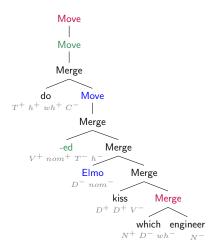
- Vast analytical coverage
  - MGs handle virtually all analyses in the generative literature
- Centrality of derivation trees
  - MGs can be viewed as CFGs with a more complicated mapping from trees to strings
- **3** Simple parsing algorithms
  - ► Variant of a recursive descent parser for CFGs
    - ⇒ cf. TAG (Rambow & Joshi, 1995; Demberg, 2008)

## Some Important Properties of MGs

- ▶ MGs are weakly equivalent to MCFGs and thus mildly context-sensitive. (Harkema 2001, Michaelis 2001)
- ▶ But we can decompose them into two finite-state components: (Michaelis et al. 2001, Kobele et al. 2007, Monnich 2006)
  - a regular language of well-formed derivation trees
  - an MSO-definable mapping from derivations to phrase structure trees
- ▶ Remember: Every regular tree language can be re-encoded as a CFG (with more fine-grained non-terminal labels). (Thatcher 1967)

## Fully Specified Derivation Trees





#### Phrase Structure Tree

#### **Derivation Tree**

## Technical Fertility of MGs

#### MGs can accommodate the full syntactic toolbox:

- sidewards movement (Stabler, 2006; Graf 2013)
- affix hopping (Graf 2012; Graf2013)
- clustering movement (Gartner & Michaelis 2010)
- tucking in (Graf 2013)
- ► ATB movement (Kobele 2008)
- copy movement (Kobele 2006)
- extraposition (Hunter &Frank 2014)
- Late Merge (Kobele 2010; Graf 2014)
- ► Agree (Kobele 2011; Graf 2011)
- ▶ adjunction (Fowlie 2013; Hunter 2015)
- ► TAG-style adjunction (Graf 2012)

## Why These Metrics?

- ► These complexity metrics are all related to storage cost (cf. Gibson, 1998)
- ▶ We could implement alternative ones
  - (cf. Ferrara-Boston, 2012)
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    - surprisal
    - feature intervention
    - status of discourse referents
    - integration, retrieval, ...
- We want to keep the model simple (but not trivial).
  - Tenure and Size only refer to the geometry of the derivation
  - they are sensitive the specifics of tree-traversal (cf. node-count; Hale, 2001)

## Why These Metrics?

- ► These complexity metrics are all related to storage cost (cf. Gibson, 1998)
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  - (cf. Ferrara-Boston, 2012)
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