Sharpening the empirical claims of generative syntax through formalization

Tim Hunter

University of Minnesota, Twin Cities

ESSLLI, August 2015

Part 1: Grammars and cognitive hypotheses

What is a grammar? What can grammars do? Concrete illustration of a target: Surprisal

Parts 2-4: Assembling the pieces

Minimalist Grammars (MGs) MGs and MCFGs Probabilities on MGs

Part 5: Learning and wrap-up

Something slightly different: Learning model Recap and open questions

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Part 3

MGs and MCFGs

Where we're up to

We've seen:

- MGs with operations defined that manipulated trees
- that the structure that "really matters" (e.g. for recursion) can be boiled down to funny-looking "derivation trees" (with things like $\langle t, -k \rangle$ at the non-leaf nodes)

Now:

- A way to think of how these derivation trees relate to surface strings (without going via trees)
- In some ways not totally necessary for the rest of the course, but helpful

Later:

- Adding probabilities to MGs: in a way that sort of works, and does some good stuff, but doesn't do everything we'd want
- Adding probabilities to MGs: in an even better way

Outline

A different perspective on CFGs

0 Concatenative and non-concatenative operations





Outline

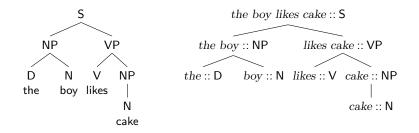
A different perspective on CFGs

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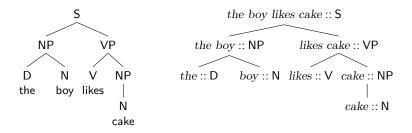




Trees



Trees



How to think of a tree:

- less as a picture of a string
- more as a graphical representation of how a string was constructed, with the string "at" the top node

Two sides of a CFG rule

A rule like 'S \rightarrow NP VP' says two things:

• What combines with what:

An NP and a VP can combine to form an S

• How to produce a string of the new category: Put the NP-string to the left of the VP-string

More explicitly:

 $st :: S \rightarrow s :: NP t :: VP$

Example: X-bar theory

Japanese

 $\begin{array}{l} \mathsf{XP} \to \mathsf{Spec} \ \mathsf{X'} \\ \mathsf{X'} \to \mathsf{Comp} \ \mathsf{X} \end{array}$

English

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Japanese

<i>st</i> :: XP	\rightarrow	<i>s</i> :: Spec	t :: X'
st :: X'	\rightarrow	<i>s</i> :: Comp	t :: X

English

<i>st</i> :: XP	\rightarrow	<i>s</i> :: Spec	<i>t</i> :: X′
ts :: X'	\rightarrow	<i>s</i> :: Comp	t :: X

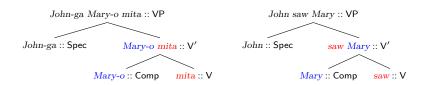
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Japanese				
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Japane	ese		
<i>st</i> :: XP	\rightarrow	<i>s</i> :: Spec	<i>t</i> :: X'
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English			
<i>st</i> :: XP	\rightarrow	<i>s</i> :: Spec	t :: X'
<i>ts</i> :: X'	\rightarrow	<mark>s</mark> :: Comp	t :: X



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10 Concatenative and non-concatenative operations

11 MCFGs

12 Back to MGs

Concatenative and non-concatenative operations

Concatenative morphology:

play + ed	\sim	played
play + ing	\sim	playing
play + s	\sim	plays

Non-concatenative morphology:

(k,t,b) + (i,aa)	\sim	kitaab	("book")
(k,t,b) + (aa,i)	\sim	kaatib	("writer")
(k,t,b) + (ma,uu)	\sim	maktuub	("written")
(k,t,b) + (a,i,a)	\sim	katiba	("document")

Concatenative and non-concatenative operations

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	$\stackrel{\sim}{\rightarrow}$	$\begin{array}{ccc} & & & kitaab \\ & & & kaatib \\ & & & maktuub \\ & & & katiba \end{array}$

Concatenative syntax:

plays + tennis	\sim	plays tennis
plays + soccer	\sim	plays soccer
$John + plays \ soccer$	\sim	John plays soccer
Mary + plays soccer	\sim	Mary plays soccer

Concatenative and non-concatenative operations

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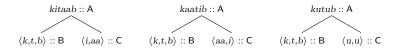
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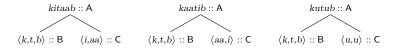
Non-concatenative syntax:

seems $+$ (John, to be tall)	\sim
seems $+$ (Mary, to be intelligent)	\sim
did $+$ (John see, who)	\sim
did $+$ (Mary meet, who)	\sim

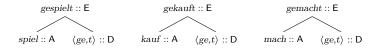
- John seems to be tall
 - Mary seems to be intelligent
- → who did John see
- $\rightsquigarrow \quad \text{who did Mary meet}$



 $stuvw :: \mathsf{A} \rightarrow \langle s, u, w \rangle :: \mathsf{B} \langle t, v \rangle :: \mathsf{C}$



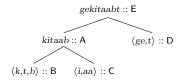
 $stuvw :: A \rightarrow \langle s, u, w \rangle :: B \langle t, v \rangle :: C$



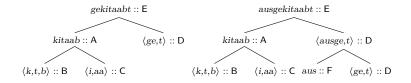
 $stu :: \mathsf{E} \rightarrow t :: \mathsf{A} \langle s, u \rangle :: \mathsf{D}$

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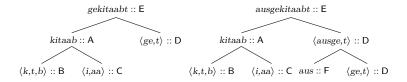
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If our goal is to characterize the array of well-formed/derivable objects — not to pronounce them — then all we care about is "what's built out of what":

$$egin{array}{cccc} \mathsf{A} &
ightarrow & \mathsf{B} & \mathsf{C} \ \mathsf{E} &
ightarrow & \mathsf{A} & \mathsf{D} \ \mathsf{D} &
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Outline

A different perspective on CFGs

Concatenative and non-concatenative operations





Multiple Context-Free Grammars (MCFGs)

 $st :: S \rightarrow s :: NP t :: VP$

An MCFG generalises to allow yields to be *tuples of strings*. $t_2 s t_1 :: Q \rightarrow s :: NP \langle t_1, t_2 \rangle :: VPWH$

This rule says two things:

- We can combine an NP with a VPWH to make a Q.
- The yield of the Q is $t_2 s t_1$, where s is the yield of the NP and $\langle t_1, t_2 \rangle$ is the yield of the VPWH.

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```
which girl the boy says is tall :: Q \rightarrow 
the boy :: NP \langle says \text{ is tall, which girl} \rangle :: VPWH
```

Some technical details

• Each nonterminal has a rank *n*, and yields only *n*-tuples of strings.

So given this rule:

 $t_2 s t_1 :: \mathbb{Q} \rightarrow s :: \mathbb{NP} \langle t_1, t_2 \rangle :: \mathbb{VPWH}$

we know that anything producing a VPWH must produce a 2-tuple. $\langle \dots, \dots \rangle :: \text{VPWH} \quad \rightarrow \quad \dots$

and that anything producing an NP must produce a 1-tuple: $\ldots ::$ NP $\quad \rightarrow \quad \ldots$

(Seki et al. 1991, Weir 1988, Vijay-Shanker et al. 1987)

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• The string-composition functions cannot copy pieces of their arguments.

OK	<i>s t</i> ::: VP	\rightarrow	<i>s</i> :: V	<i>t</i> :: NP
OK	t s himself :: S	\rightarrow	<i>s</i> :: V	<i>t</i> :: NP
Not OK	<i>t s t</i> :: S	\rightarrow	<i>s</i> :: V	<i>t</i> :: NP

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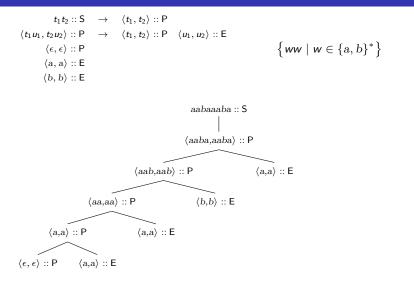
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• Essentially equivalent to linear context-free rewriting systems (LCFRSs).

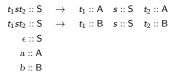
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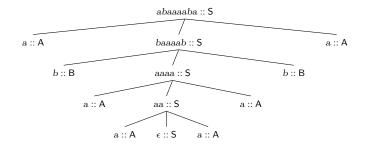
Beyond context-free



Unlike in a CFG, we can ensure that the two "halves" are extended in the same ways without concatenating them together.

For comparison





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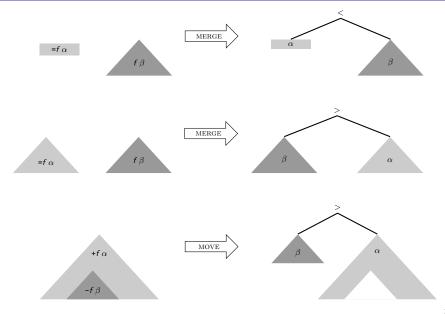
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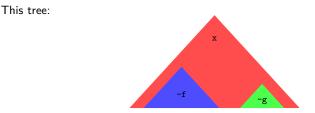




Merge and move



What matters in a (derived) tree



becomes a tuple of categorized strings:

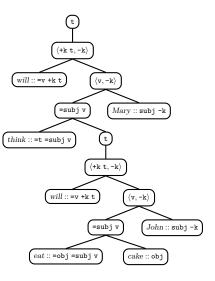


or, equivalently, a tuple-of-strings, categorized by a tuple-of-categories: $\langle s,t,u\rangle\,::\,\langle {\tt x},-{\tt f},-{\tt g}\rangle_0$

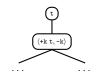
(Michaelis 2001, Stabler and Keenan 2003)

Remember MG derivation trees?

- We can tell that this tree represents a well-formed derivation, by checking the feature-manipulations at each step.
- How can we work out which string it derives?
 - Build up a tree according to merge and move rules, and read off leaves of the tree.
 - But there's a simpler way.



Producing a string from a derivation tree



What do we need to have computed at the $\langle +k\ t, -k\rangle$ node, in order to compute the final string

Mary will think John will eat cake

at the t node?

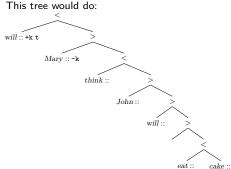
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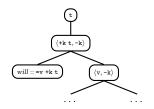
at the t node?



But all we actually need to know is:

- What's the string corresponding to the part that's going to move to check -k?
- What's the string corresponding to the leftovers?

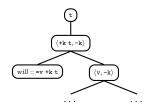
These questions are answered by the tuple ⟨will think John will eat cake, Mary⟩

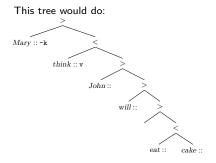


What do we need to have computed at the $\langle v, \neg k\rangle$ node, in order to compute the desired tuple

 $\langle will \ think \ John \ will \ eat \ cake, \ Mary \rangle$

at the $\langle +k t, -k \rangle$ node?





What do we need to have computed at the $\langle v, -k\rangle$ node, in order to compute the desired tuple

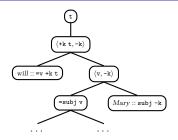
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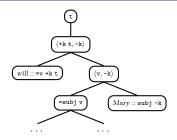
These questions are answered by the tuple $\langle think John will \ eat \ cake, \ Mary \rangle$



What do we need to have computed at the =subj v node, in order to compute the desired tuple

(think John will eat cake, Mary)

at the $\langle \mathtt{v}, \mathtt{-k} \rangle$ node?

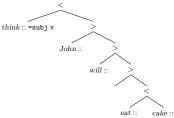


What do we need to have computed at the =subj v node, in order to compute the desired tuple

(think John will eat cake, Mary)

at the $\langle v, -k \rangle$ node?

This tree would do:

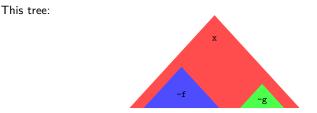


But all we actually need to know is:

• What's the string corresponding to the entire tree? (The "leftovers after no movement".)

This question is answered by the string think John will eat cake

What matters in a (derived) tree



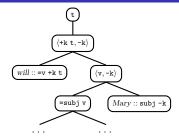
becomes a tuple of categorized strings:



or, equivalently, a tuple-of-strings, categorized by a tuple-of-categories: $\langle s,t,u\rangle\,::\,\langle {\tt x},-{\tt f},-{\tt g}\rangle_0$

(Michaelis 2001, Stabler and Keenan 2003)

MCFG rules



 $t_2 t_1 :: t \rightarrow \langle t_1, t_2 \rangle :: \langle +k t, -k \rangle$ Mary will think John will eat cake :: $t \rightarrow \langle \text{will think John will eat cake, Mary} \rangle :: \langle +k t, -k \rangle$

 $\langle st_1, t_2 \rangle :: \langle +k t, -k \rangle \longrightarrow s :: = v + k t \langle t_1, t_2 \rangle :: \langle v, -k \rangle$

 $(will think John will eat cake, Mary) :: (+ k t, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow will :: = v + k t \quad (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) :: (v, - k) \rightarrow (think John will eat cake, Mary) = (think John will eat cake, Mary) = (think John will eat cake, Mary) = (think John will eat cake, Mary) = (think John will eat cake, Mary) = (think John will eat cake, Mary) = (think John will eat cake, Mary$

 $\begin{array}{ccc} \langle s,t\rangle::\langle\mathtt{v},\mathtt{-k}\rangle & \to & s::\mathtt{subj}\,\mathtt{v} & t::\mathtt{subj}\,\mathtt{-k} \\ \langle think \ John \ will \ eat \ cake, \ Mary\rangle::\langle\mathtt{v},\mathtt{-k}\rangle & \to & think \ John \ will \ eat \ cake::\mathtt{subj}\,\mathtt{v} & Mary::\mathtt{subj}\,\mathtt{-k} \end{array}$

One slightly annoying wrinkle

We know that this is a valid derivational step:



2	2
\leq	\searrow
[=f α]	(f)
\square	\cup

What is the corresponding	MCFG rule?
---------------------------	------------

Selected thing on the right?

 $st :: \alpha \rightarrow s :: = f \alpha t :: f$

Selected thing on the left?

 $ts:: \alpha \rightarrow s::=f \alpha \quad t:: f$

One slightly annoying wrinkle

We know that this is a valid derivational step:

f =f α



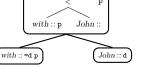
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Selected thing on the right?



Selected thing on the left?

 \rightarrow s::=f α t::f $ts::\alpha$



 α

=f α

::f

One slightly annoying wrinkle

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What is the corresponding MCFG rule?

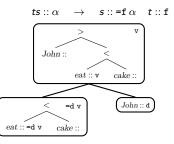
Selected thing on the right?

$$st :: \alpha \rightarrow s :: = \mathbf{f} \alpha \quad t$$

$$(\mathbf{f} \mathbf{f} \mathbf{f})$$

$$(\mathbf{f} \mathbf$$

Selected thing on the left?



One slightly annoying wrinkle

Each type needs to record not only the unchecked features, but also whether the expression is lexical.

I'll write lexical types as $\langle \ldots \rangle_1$ and non-lexical types as $\langle \ldots \rangle_0$.

So types of the form $\langle =f \alpha \rangle_1$ act slightly differently from those of the form $\langle =f \alpha \rangle_0$.

$$st ::: \langle \alpha \rangle_{0} \quad \rightarrow \quad s ::: \langle = \mathbf{f} \; \alpha \rangle_{1} \quad t ::: \langle \mathbf{f} \rangle_{n}$$

with John ::: $\langle \mathbf{p} \rangle_{0} \quad \rightarrow \quad \text{with} ::: \langle = \mathbf{d} \; \mathbf{p} \rangle_{1} \quad John ::: \langle \mathbf{d} \rangle_{1}$

$$\begin{split} ts :: \langle \alpha \rangle_0 & \to \quad s :: \langle \texttt{=f} \; \alpha \rangle_0 \quad t :: \langle \texttt{f} \rangle_n \\ John \; eat \; cake :: \langle \texttt{v} \rangle_0 & \to \quad eat \; cake :: \langle \texttt{=d} \; \texttt{v} \rangle_0 \quad John :: \langle \texttt{d} \rangle_1 \end{split}$$

Context-free structure

$$\begin{array}{rcl} \langle \texttt{=subj } \texttt{v} \rangle & \rightarrow & \langle \texttt{=q =subj } \texttt{v} \rangle & \langle \texttt{q} \rangle \\ & \langle \texttt{q} \rangle & \rightarrow & \langle \texttt{+wh } \texttt{q}, \texttt{-wh} \rangle \\ \langle \texttt{+wh } \texttt{q}, \texttt{-wh} \rangle & \rightarrow & \langle \texttt{=t +wh } \texttt{q} \rangle & \langle \texttt{t}, \texttt{-wh} \rangle \end{array}$$

Context-free structure

$$\begin{array}{rcl} \langle = & \texttt{subj v} \rangle & \to & \langle = \texttt{q} = & \texttt{subj v} \rangle & \langle \texttt{q} \rangle \\ & \langle \texttt{q} \rangle & \to & \langle \texttt{+wh q}, \texttt{-wh} \rangle \\ \langle \texttt{+wh q}, \texttt{-wh} \rangle & \to & \langle \texttt{=t +wh q} \rangle & \langle \texttt{t}, \texttt{-wh} \rangle \end{array}$$

General schemas for MERGE steps (approximate):

$$\begin{array}{lll} \langle \gamma, \alpha_1, \dots, \alpha_j, \beta_1, \dots, \beta_k \rangle & \to & \langle \texttt{=} \texttt{f} \gamma, \alpha_1, \dots, \alpha_j \rangle & \langle \texttt{f}, \beta_1, \dots, \beta_k \rangle \\ \langle \gamma, \alpha_1, \dots, \alpha_j, \delta, \beta_1, \dots, \beta_k \rangle & \to & \langle \texttt{=} \texttt{f} \gamma, \alpha_1, \dots, \alpha_j \rangle & \langle \texttt{f} \delta, \beta_1, \dots, \beta_k \rangle \end{array}$$

General schemas for MOVE steps (approximate):

$$\begin{array}{lll} \langle \gamma, \alpha_1, \dots, \alpha_{i-1}, \alpha_{i+1}, \dots, \alpha_k \rangle & \to & \langle \texttt{+f}\gamma, \alpha_1, \dots, \alpha_{i-1}, \texttt{-f}, \alpha_{i+1}, \dots, \alpha_k \rangle \\ \langle \gamma, \alpha_1, \dots, \alpha_{i-1}, \delta, \alpha_{i+1}, \dots, \alpha_k \rangle & \to & \langle \texttt{+f}\gamma, \alpha_1, \dots, \alpha_{i-1}, \texttt{-f}\delta, \alpha_{i+1}, \dots, \alpha_k \rangle \end{array}$$

Context-free structure

$$\begin{array}{rcl} \langle \texttt{=subj v} \rangle & \to & \langle \texttt{=q =subj v} \rangle & \langle q \rangle \\ & \langle q \rangle & \to & \langle \texttt{+wh } q, \texttt{-wh} \rangle \\ \langle \texttt{+wh } q, \texttt{-wh} \rangle & \to & \langle \texttt{=t +wh } q \rangle & \langle \texttt{t}, \texttt{-wh} \rangle \end{array}$$

General schemas for MERGE steps (approximate):

$$\begin{array}{lll} \langle \gamma, \alpha_1, \dots, \alpha_j, \beta_1, \dots, \beta_k \rangle & \to & \langle \texttt{=} \texttt{f} \gamma, \alpha_1, \dots, \alpha_j \rangle & \langle \texttt{f}, \beta_1, \dots, \beta_k \rangle \\ \langle \gamma, \alpha_1, \dots, \alpha_j, \delta, \beta_1, \dots, \beta_k \rangle & \to & \langle \texttt{=} \texttt{f} \gamma, \alpha_1, \dots, \alpha_j \rangle & \langle \texttt{f} \delta, \beta_1, \dots, \beta_k \rangle \end{array}$$

General schemas for MOVE steps (approximate):

$$\begin{array}{lll} \langle \gamma, \alpha_1, \dots, \alpha_{i-1}, \alpha_{i+1}, \dots, \alpha_k \rangle & \to & \langle \texttt{+f}\gamma, \alpha_1, \dots, \alpha_{i-1}, \texttt{-f}, \alpha_{i+1}, \dots, \alpha_k \rangle \\ \langle \gamma, \alpha_1, \dots, \alpha_{i-1}, \delta, \alpha_{i+1}, \dots, \alpha_k \rangle & \to & \langle \texttt{+f}\gamma, \alpha_1, \dots, \alpha_{i-1}, \texttt{-f}\delta, \alpha_{i+1}, \dots, \alpha_k \rangle \end{array}$$

- MOVE steps change something without combining it with anything
- Compare with unary CFG rules, or type-raising in CCG, or ...

Three schemas for MERGE rules:

$$\begin{array}{ccc} \langle st, t_1, \dots, t_k \rangle :: \langle \gamma, \alpha_1, \dots, \alpha_k \rangle_0 & \to \\ & s :: \langle \texttt{=f}\gamma \rangle_1 & \langle t, t_1, \dots, t_k \rangle :: \langle \texttt{f}, \alpha_1, \dots, \alpha_k \rangle_n \end{array}$$

$$\begin{array}{l} \langle ts, s_1, \dots, s_j, t_1, \dots, t_k \rangle :: \langle \gamma, \alpha_1, \dots, \alpha_j, \beta_1, \dots, \beta_k \rangle_0 & \rightarrow \\ & \langle s, s_1, \dots, s_j \rangle :: \langle = \mathbf{f} \gamma, \alpha_1, \dots, \alpha_j \rangle_0 & \langle t, t_1, \dots, t_k \rangle :: \langle \mathbf{f}, \beta_1, \dots, \beta_k \rangle_n \end{array}$$

$$\begin{array}{l} \langle \boldsymbol{s}, \boldsymbol{s}_1, \dots, \boldsymbol{s}_j, \boldsymbol{t}, \boldsymbol{t}_1, \dots, \boldsymbol{t}_k \rangle :: \langle \boldsymbol{\gamma}, \alpha_1, \dots, \alpha_j, \boldsymbol{\delta}, \beta_1, \dots, \beta_k \rangle_0 & \rightarrow \\ & \langle \boldsymbol{s}, \boldsymbol{s}_1, \dots, \boldsymbol{s}_j \rangle :: \langle \texttt{=f} \boldsymbol{\gamma}, \alpha_1, \dots, \alpha_j \rangle_n & \langle \boldsymbol{t}, \boldsymbol{t}_1, \dots, \boldsymbol{t}_k \rangle :: \langle \texttt{f} \boldsymbol{\delta}, \beta_1, \dots, \beta_k \rangle_{n'} \end{array}$$

Two schemas for $\ensuremath{\operatorname{MOVE}}$ rules:

$$\begin{array}{ccc} \langle \mathbf{s}_i \mathbf{s}, \mathbf{s}_1, \dots, \mathbf{s}_{i-1}, \mathbf{s}_{i+1}, \dots, \mathbf{s}_k \rangle & :: \langle \gamma, \alpha_1, \dots, \alpha_{i-1}, \alpha_{i+1}, \dots, \alpha_k \rangle_0 & \rightarrow \\ & \langle \mathbf{s}, \mathbf{s}_1, \dots, \mathbf{s}_i, \dots, \mathbf{s}_k \rangle & :: \langle \mathbf{+f}\gamma, \alpha_1, \dots, \alpha_{i-1}, -\mathbf{f}, \alpha_{i+1}, \dots, \alpha_k \rangle_0 \end{array}$$

$$\begin{array}{ccc} \langle \boldsymbol{s}, \boldsymbol{s}_1, \dots, \boldsymbol{s}_i, \dots, \boldsymbol{s}_k \rangle & :: \langle \boldsymbol{\gamma}, \alpha_1, \dots, \alpha_{i-1}, \boldsymbol{\delta}, \alpha_{i+1}, \dots, \alpha_k \rangle_0 & \rightarrow \\ & \langle \boldsymbol{s}, \boldsymbol{s}_1, \dots, \boldsymbol{s}_i, \dots, \boldsymbol{s}_k \rangle & :: \langle \texttt{+f} \boldsymbol{\gamma}, \alpha_1, \dots, \alpha_{i-1}, \texttt{-f} \boldsymbol{\delta}, \alpha_{i+1}, \dots, \alpha_k \rangle_0 \end{array}$$

Part 1: Grammars and cognitive hypotheses

What is a grammar? What can grammars do? Concrete illustration of a target: Surprisal

Parts 2-4: Assembling the pieces

Minimalist Grammars (MGs) MGs and MCFGs Probabilities on MGs

Part 5: Learning and wrap-up

Something slightly different: Learning model Recap and open questions

- Billot, S. and Lang, B. (1989). The structure of shared forests in ambiguous parsing. In *Proceedings of the 1989 Meeting of the Association of Computational Linguistics*.
- Chomsky, N. (1965). Aspects of the Theory of Syntax. MIT Press, Cambridge, MA.
- Chomsky, N. (1980). Rules and Representations. Columbia University Press, New York.
- Ferreira, F. (2005). Psycholinguistics, formal grammars, and cognitive science. The Linguistic Review, 22:365–380.
- Frazier, L. and Clifton, C. (1996). Construal. MIT Press, Cambridge, MA.
- Gärtner, H.-M. and Michaelis, J. (2010). On the Treatment of Multiple-Wh Interrogatives in Minimalist Grammars. In Hanneforth, T. and Fanselow, G., editors, *Language and Logos*, pages 339–366. Akademie Verlag, Berlin.
- Gibson, E. and Wexler, K. (1994). Triggers. Linguistic Inquiry, 25:407-454.
- Hale, J. (2006). Uncertainty about the rest of the sentence. Cognitive Science, 30:643-Âŋ672.
- Hale, J. T. (2001). A probabilistic earley parser as a psycholinguistic model. In Proceedings of the Second Meeting of the North American Chapter of the Association for Computational Linguistics.
- Hunter, T. (2011). Insertion Minimalist Grammars: Eliminating redundancies between merge and move. In Kanazawa, M., Kornai, A., Kracht, M., and Seki, H., editors, *The Mathematics of Language (MOL 12 Proceedings)*, volume 6878 of *LNCS*, pages 90–107, Berlin Heidelberg. Springer.
- Hunter, T. and Dyer, C. (2013). Distributions on minimalist grammar derivations. In *Proceedings of* the 13th Meeting on the Mathematics of Language.

References II

Koopman, H. and Szabolcsi, A. (2000). Verbal Complexes. MIT Press, Cambridge, MA.

Lang, B. (1988). Parsing incomplete sentences. In Proceedings of the 12th International Conference on Computational Linguistics, pages 365–371.

Levy, R. (2008). Expectation-based syntactic comprehension. Cognition, 106(3):1126-1177.

- Michaelis, J. (2001). Derivational minimalism is mildly context-sensitive. In Moortgat, M., editor, Logical Aspects of Computational Linguistics, volume 2014 of LNCS, pages 179–198. Springer, Berlin Heidelberg.
- Miller, G. A. and Chomsky, N. (1963). Finitary models of language users. In Luce, R. D., Bush, R. R., and Galanter, E., editors, *Handbook of Mathematical Psychology*, volume 2. Wiley and Sons, New York.
- Morrill, G. (1994). Type Logical Grammar: Categorial Logic of Signs. Kluwer, Dordrecht.
- Nederhof, M. J. and Satta, G. (2008). Computing partition functions of pcfgs. Research on Language and Computation, 6(2):139–162.
- Seki, H., Matsumara, T., Fujii, M., and Kasami, T. (1991). On multiple context-free grammars. Theoretical Computer Science, 88:191–229.
- Stabler, E. P. (2006). Sidewards without copying. In Wintner, S., editor, Proceedings of The 11th Conference on Formal Grammar, pages 157–170, Stanford, CA. CSLI Publications.
- Stabler, E. P. (2011). Computational perspectives on minimalism. In Boeckx, C., editor, *The Oxford Handbook of Linguistic Minimalism*. Oxford University Press, Oxford.
- Stabler, E. P. and Keenan, E. L. (2003). Structural similarity within and among languages. Theoretical Computer Science, 293:345–363.

- Vijay-Shanker, K., Weir, D. J., and Joshi, A. K. (1987). Characterizing structural descriptions produced by various grammatical formalisms. In *Proceedings of the 25th Meeting of the Association for Computational Linguistics*, pages 104–111.
- Weir, D. (1988). Characterizing mildly context-sensitive grammar formalisms. PhD thesis, University of Pennsylvania.
- Yngve, V. H. (1960). A model and an hypothesis for language structure. In Proceedings of the American Philosophical Society, volume 104, pages 444–466.