

# An Abstract Categorical Grammar Approach to the Discourse Modeling

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Göteborg, Sweden

# Discourse

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Various kinds of natural language acts

- spoken
- written
  - ▶ monologues texts
  - ▶ dialogs
- multi-modal
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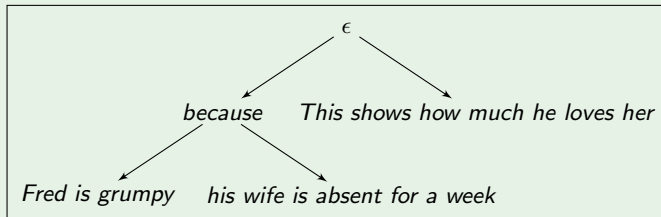
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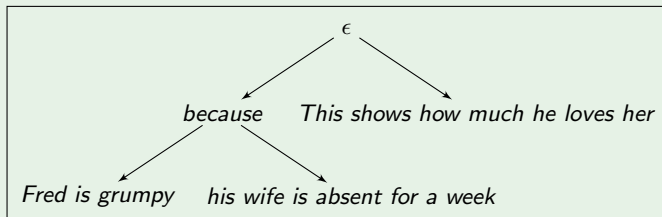
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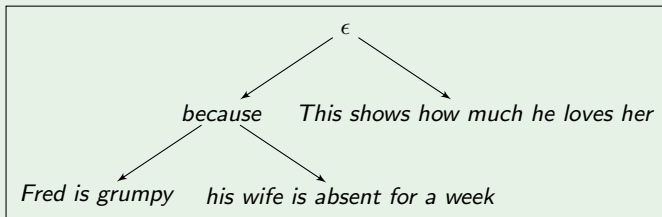
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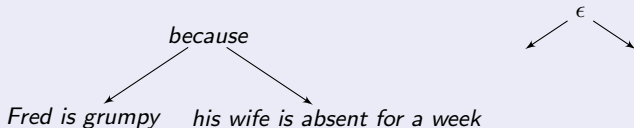
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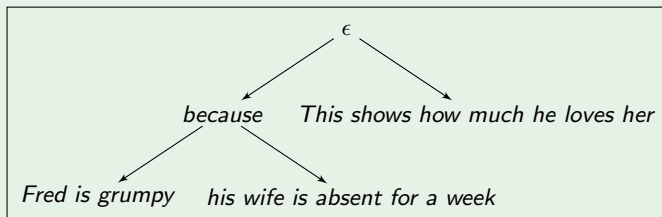
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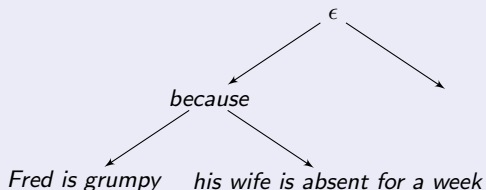
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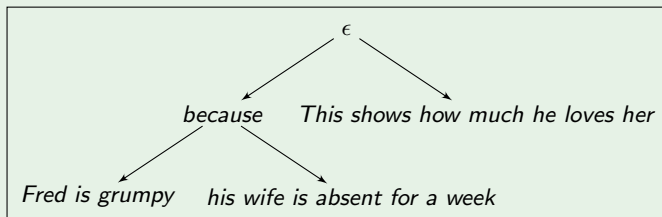
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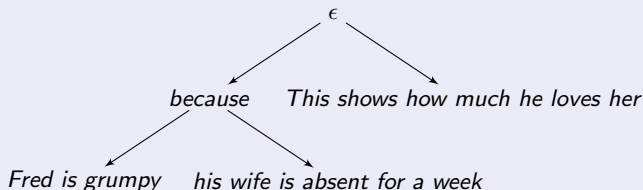
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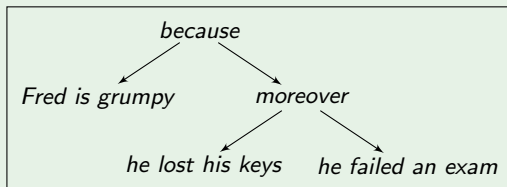
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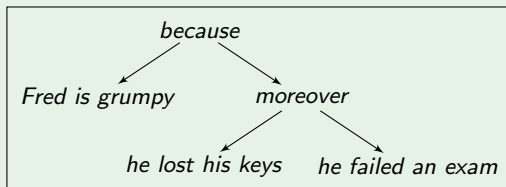
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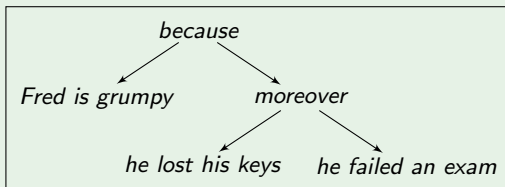
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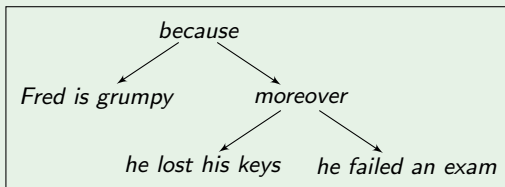




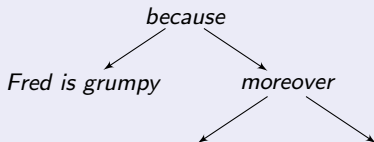
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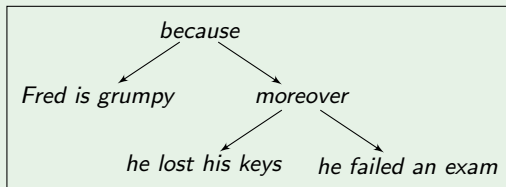
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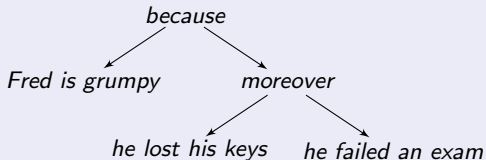
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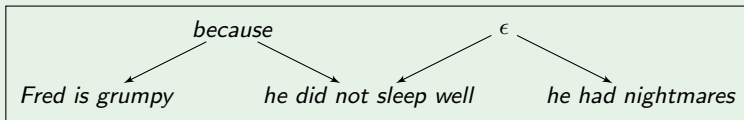
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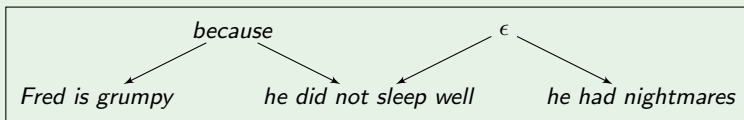
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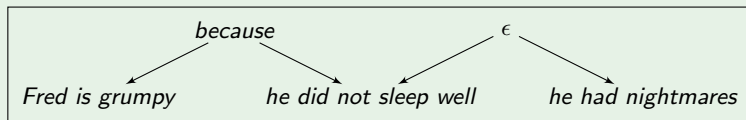


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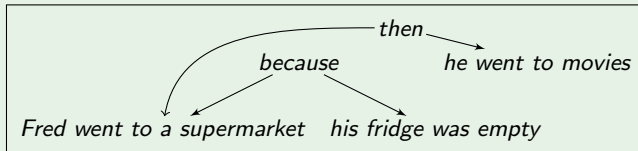
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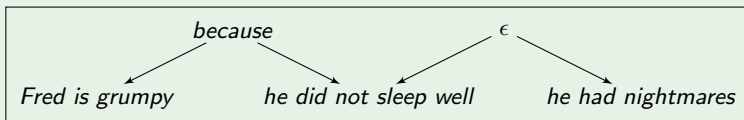
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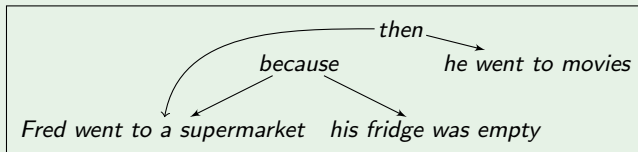
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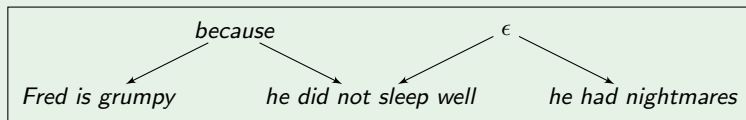


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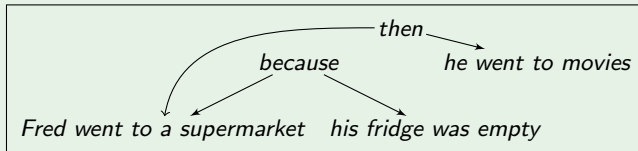
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Mismatch between the clause-level and discourse-level analyses of clause-medial connectives

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Discourse formalisms

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### Discourse formalisms and their properties

	Parsing	Generation	Tree	DAG
G-TAG (Danlos, 1998)	X	✓	✓	X
D-LTAG (Webber & Joshi, 1998)	✓	X	✓	X
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### Ad hoc encoding of clause-medial connectives

- Prohibits having reversible grammars – both parsing & generation
- Prohibits generalizations

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- Study existing discourse formalisms with ACGs + incorporate clause-medial connectives
- Develop tractable encodings
  - ▶ Discourse parsing
  - ▶ Discourse generation

# Plan

## 1 TAG

## 2 Discourse formalisms

- Properties of grammars of D-LTAG, G-TAG, D-STAG
- Discourse parsing
- Problem of clause-medial connectives & a possible analysis
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## 3 ACG

- Definition & basic properties
- TAG as ACG
- TAG with semantics as ACG

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- D-STAG as ACGs + clause-medial connectives
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# Outline

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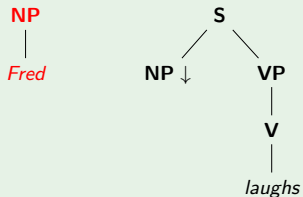
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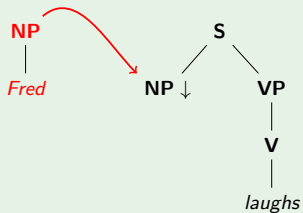
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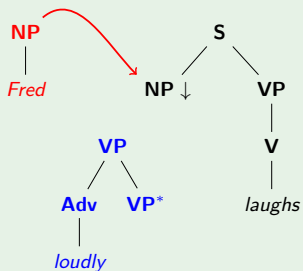
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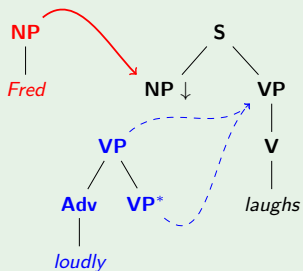
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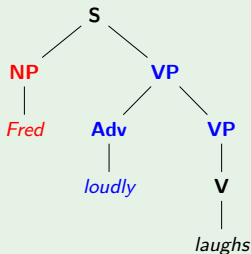
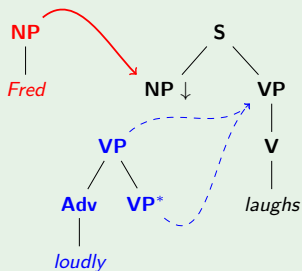
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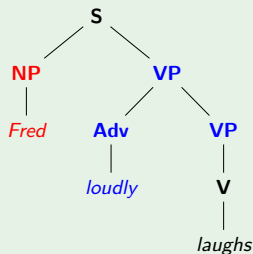
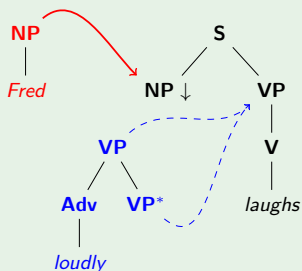
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Generated structures – derived trees. Their by-products – *derivation trees*

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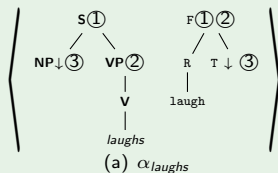


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(Shieber&Schabes, 1990)

- Elementary structures - pairs of TAG trees  $\langle t_{\text{syn}}, t_{\text{sem}} \rangle$
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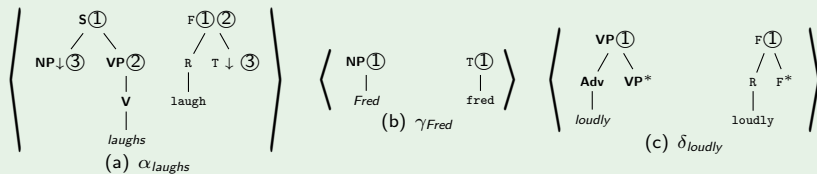
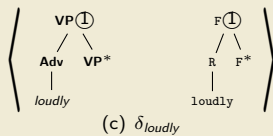
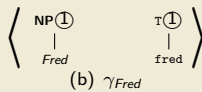
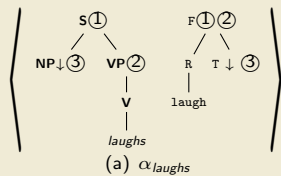
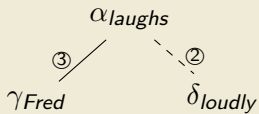
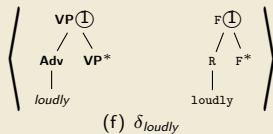
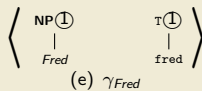
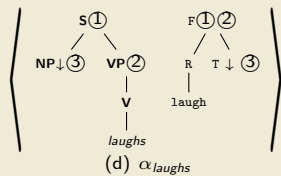


Figure – STAG elementary structures

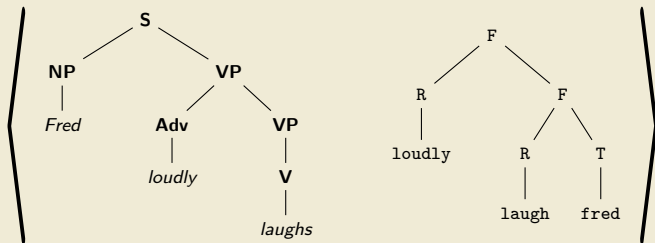
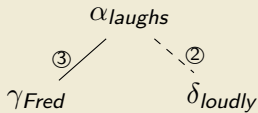
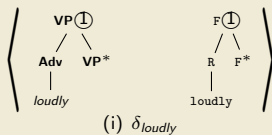
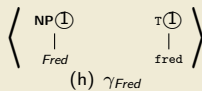
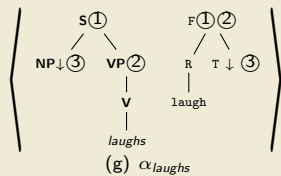
# STAG Example



# STAG Example



# STAG Example



# Outline

## 1 TAG

## 2 Discourse formalisms

- Properties of grammars of D-LTAG, G-TAG, D-STAG
- Discourse parsing
- Problem of clause-medial connectives & a possible analysis
- D-STAG

## 3 ACG

- Definition & basic properties
- TAG as ACG
- TAG with semantics as ACG

## 4 D-STAG as ACG

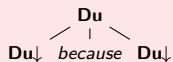
- D-STAG as ACGs + clause-medial connectives
- D-STAG as ACGs with labeled semantics

## D-LTAG, G-TAG, and D-STAG elementary trees

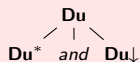
## D-LTAG, G-TAG, and D-STAG elementary trees

### Discourse-level grammar : D-LTAG

Subordinating conjunctions



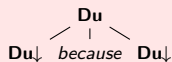
Coordinating conjunctions



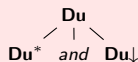
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Adverbials

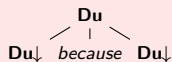




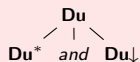
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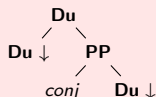


Adverbials

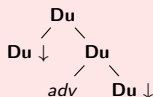


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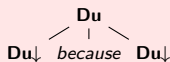
Adverbial connectives



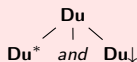
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Coordinating conjunctions

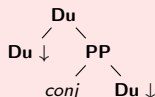


Adverbials

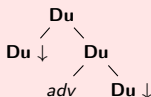


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Subordinate conjunctions

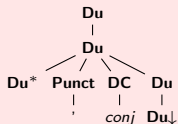


Adverbial connectives

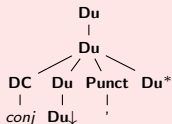


## Discourse-level grammar : D-STAG

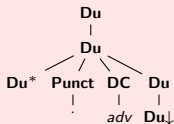
Postposed conjunctions



Preposed conjunctions



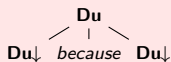
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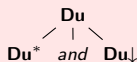
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## Discourse-level grammar : D-LTAG

Subordinating conjunctions



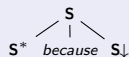
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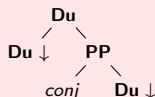


## Clause-level grammar

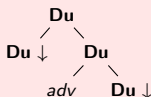


## Discourse-level grammar : G-TAG

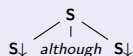
Subordinate conjunctions



Adverbial connectives

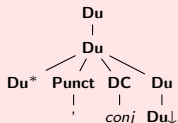


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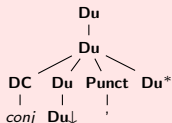


## Discourse-level grammar : D-STAG

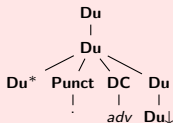
Postposed conjunctions



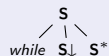
Preposed conjunctions



Adverbial connectives



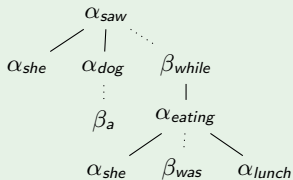
## Clause-level grammar



# Extraction of trees and construction of an input for a discourse parser

## While she was eating lunch, she saw a dog

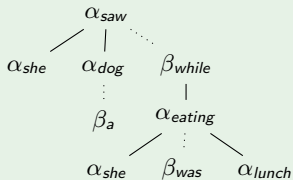
Syntactic analysis



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Syntactic analysis

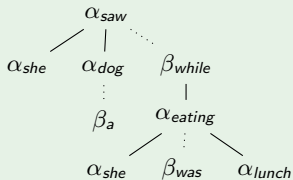


Constructing elementary trees of D-LTAG

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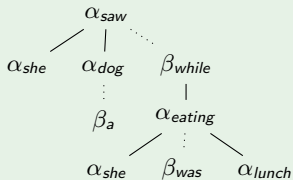
Constructing elementary trees of D-LTAG

**Du**  
|  
 $d_{saw}$

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Constructing elementary trees of D-LTAG

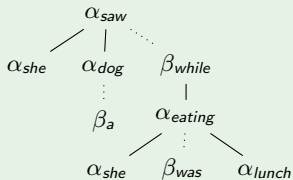
**Du**  
|  
 $d_{saw}$

**Du**  
|  
 $d_{eating}$

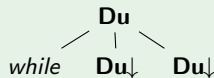
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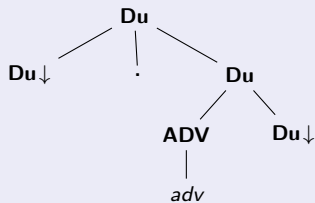
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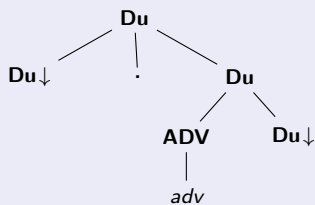
## An approach to clause-medial connectives

### Elementary tree

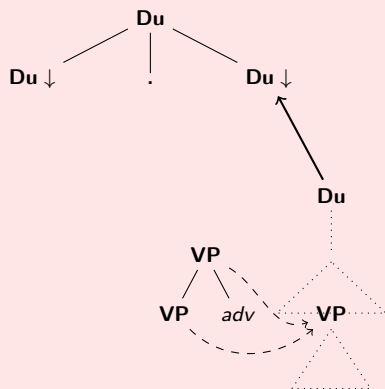


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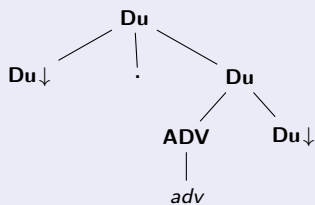


### A possible analysis

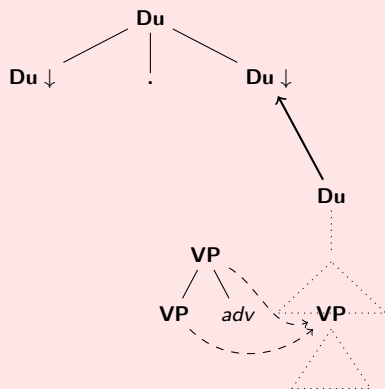


## An approach to clause-medial connectives

### Elementary tree



### A possible analysis



How to encode such a constraint with TAG or sl-MCTAG?

# Discourse Synchronous TAG (D-STAG)

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## Characteristics

- Based on Synchronous TAG (STAG)
- Generates DAGs as discourse structures

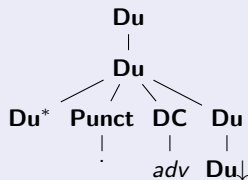
# Discourse Synchronous TAG (D-STAG)

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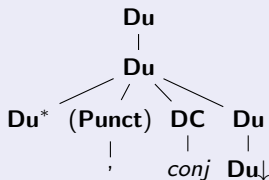
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## Elementary trees - Syntax

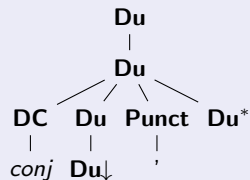
Adverbial connectives



Postposed conjunctions



Preposed conjunctions



# D-STAG Discourse Parsing

## Ambiguity

Input (string of clauses and connectives) :

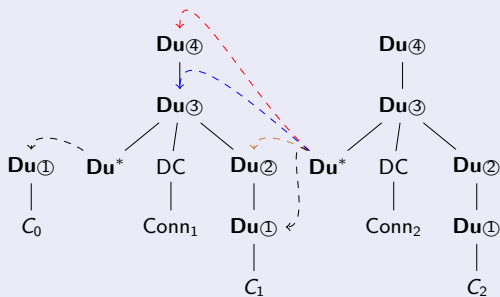
$$C_0 \text{ Conn}_1 C_1 \text{ Conn}_2 C_2$$

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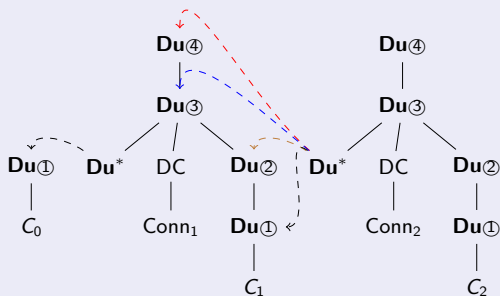


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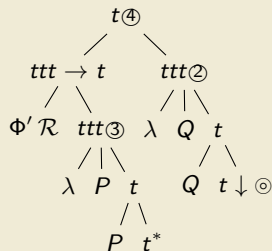
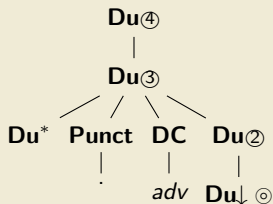
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A number of attachment sites with the same yield causes a high ambiguity in parsing. They are needed for obtaining various semantic interpretations.

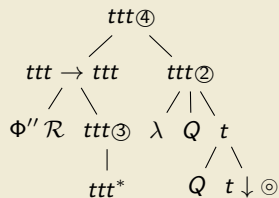
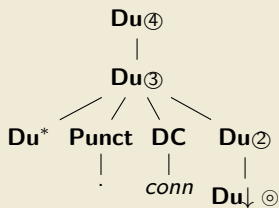
## D-STAG semantics



$$\Phi' \mathcal{R} = \lambda X Y.X(\lambda x.Y(\lambda y.\mathcal{R}(x,y)))$$

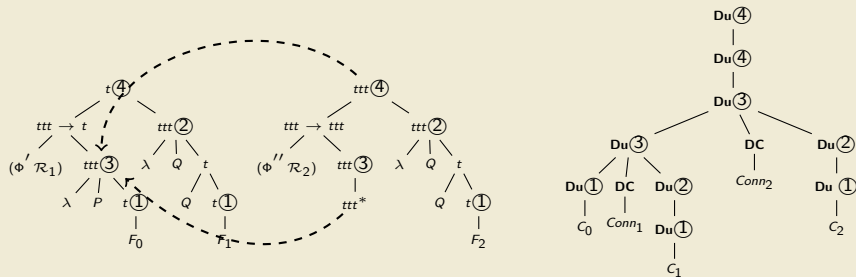
$$(t \rightarrow t) \rightarrow t \triangleq ttt$$

## D-STAG semantics

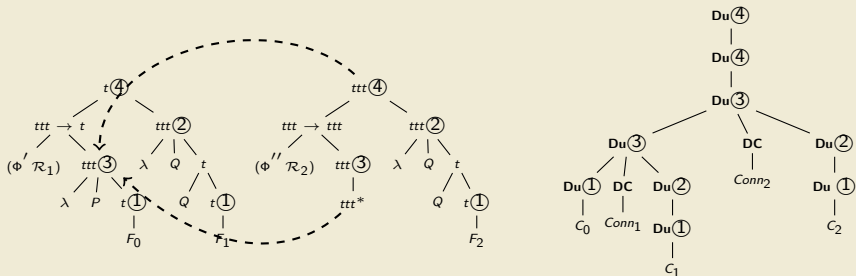


$$\phi'' \mathcal{R} = \lambda X Y P.X(\lambda x.Y(\lambda y.\mathcal{R}(x,y) \wedge P(x)))$$

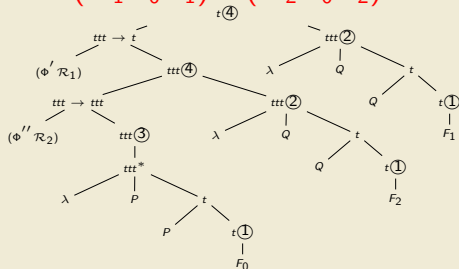
**Example :** [Fred went to a supermarket]<sub>0</sub> because [his fridge was empty]<sub>1</sub>. Then, [he went to movies]<sub>2</sub>.



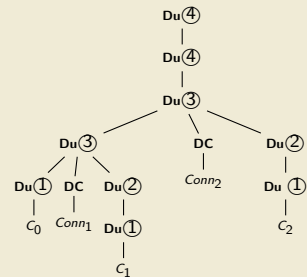
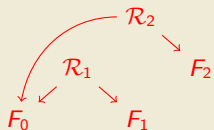
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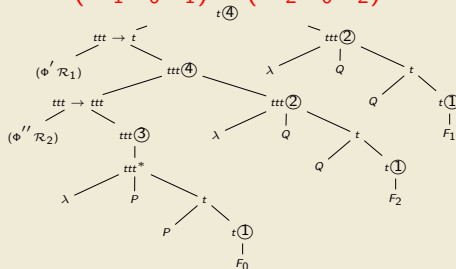
$$(\mathcal{R}_1 F_0 F_1) \wedge (\mathcal{R}_2 F_0 F_2)$$



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(de Groote, 2001)

## Main Features

- ACGs are a **grammatical framework**



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**ACGs can be composed**

**Parsing** 2nd order ACGs are **reversible** (Salvati 2005), (Kanazawa 2007)

# From TAG derivation to TAG derived trees

Derivation trees

Their interpretations as derived trees

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NP  
|  
*Fred*

## From TAG derivation to TAG derived trees

Derivation trees

$C_{Fred} : \mathbf{NP}$

Their interpretations as derived trees

$\mathbf{NP}_1$  *Fred*

$\mathbf{NP}$   
|  
*Fred*



## From TAG derivation to TAG derived trees

### Derivation trees

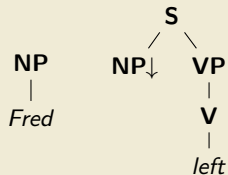
$C_{Fred} : \mathbf{NP}$

$C_{left} : \mathbf{S}_A \multimap \mathbf{VP}_A \multimap \mathbf{NP} \multimap \mathbf{S}$

### Their interpretations as derived trees

$\mathbf{NP}_1 \text{ Fred}$

$\lambda S A np.S(\mathbf{S}_2 np (A (\mathbf{VP}_1 (\mathbf{V}_1 \text{ left}))))$



## From TAG derivation to TAG derived trees

### Derivation trees

$C_{Fred} : \mathbf{NP}$

$C_{left} : \mathbf{S}_A \multimap \mathbf{VP}_A \multimap \mathbf{NP} \multimap \mathbf{S}$

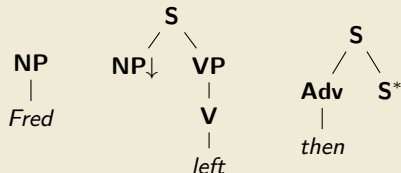
$C_{then}^S : \mathbf{S}_A \multimap \mathbf{S}_A$

### Their interpretations as derived trees

$\mathbf{NP}_1 Fred$

$\lambda S A np.S(\mathbf{S}_2 np (A (\mathbf{VP}_1 (\mathbf{V}_1 left))))$

$\lambda A x.A (\mathbf{S}_2 (\mathbf{Adv}_1 then) x)$



## From TAG derivation to TAG derived trees

### Derivation trees

$C_{Fred} : \mathbf{NP}$

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$C_{then}^S : \mathbf{S}_A \multimap \mathbf{S}_A$

$C_{then}^{VP} : \mathbf{VP}_A \multimap \mathbf{VP}_A$

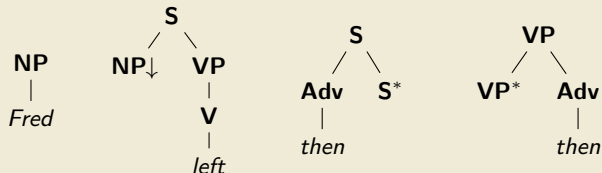
### Their interpretations as derived trees

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# From TAG derivation to TAG derived trees

## Derivation trees

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$C_{then}^{VP} : \mathbf{VP}_A \multimap \mathbf{VP}_A$

$I_X : X_A$

## Their interpretations as derived trees

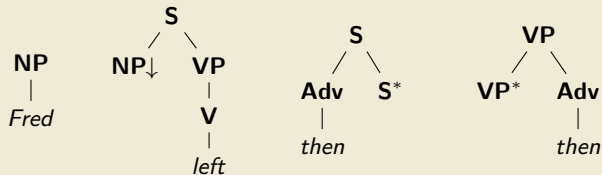
$\mathbf{NP}_1 Fred$

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$\lambda A x.A (\mathbf{S}_2 (\mathbf{Adv}_1 then) x)$

$\lambda A x.A (\mathbf{V}_2 x (\mathbf{Adv}_1 then))$

$\lambda x.x$



# From TAG derivation to TAG derived trees

## Derivation trees

$C_{Fred} : NP$

$C_{left} : S_A \multimap VP_A \multimap NP \multimap S$

$C_{then}^S : S_A \multimap S_A$

$C_{then}^{VP} : VP_A \multimap VP_A$

$I_X : X_A$

## Their interpretations as derived trees

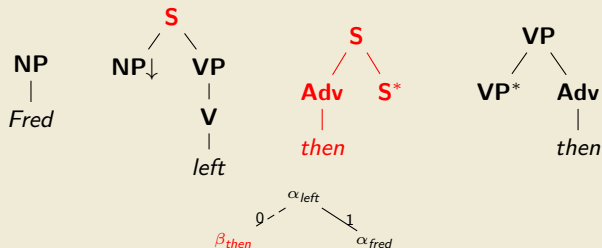
$NP_1 Fred$

$\lambda S A np.S(S_2 np (A (VP_1 (V_1 left))))$

$\lambda A x.A (S_2 (Adv_1 then) x)$

$\lambda A x.A (V_2 x (Adv_1 then))$

$\lambda x.x$



$$t_1 = C_{left} (C_{then}^S I_S) I_V C_{Fred}$$

$$\mathcal{G}_{yield} \circ \mathcal{G}_{derived\ trees}(t_1) = then+, +Fred + left$$

# From TAG derivation to TAG derived trees

## Derivation trees

$C_{Fred} : NP$

$C_{left} : S_A \multimap VP_A \multimap NP \multimap S$

$C_{then}^S : S_A \multimap S_A$

$C_{then}^{VP} : VP_A \multimap VP_A$

$I_X : X_A$

## Their interpretations as derived trees

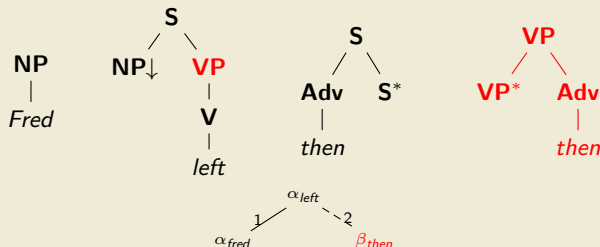
$NP_1 Fred$

$\lambda S A np.S(S_2 np (A (VP_1 (V_1 left))))$

$\lambda A x.A (S_2 (Adv_1 then) x)$

$\lambda A x.A (V_2 x (Adv_1 then))$

$\lambda x.x$



$$t_2 = C_{left} I_S (C_{then}^V I_V) C_{Fred}$$

$$\mathcal{G}_{yield} \circ \mathcal{G}_{derived\ trees}(t_2) = Fred + then + left$$

TAG derivation  
trees  $\Lambda(\Sigma_{TAG})$

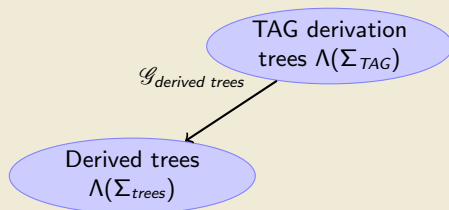
## TAG as ACGs

TAG derivation  
trees  $\Lambda(\Sigma_{TAG})$

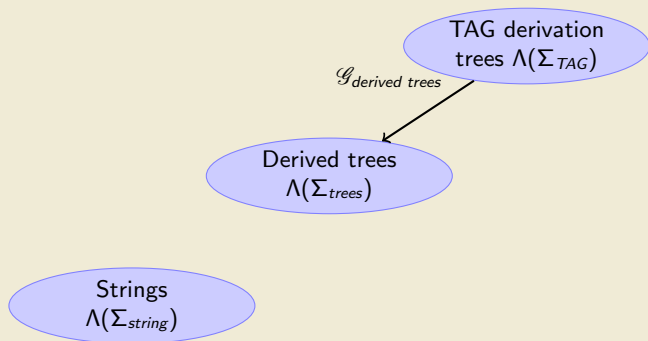
Derived trees  
 $\Lambda(\Sigma_{trees})$



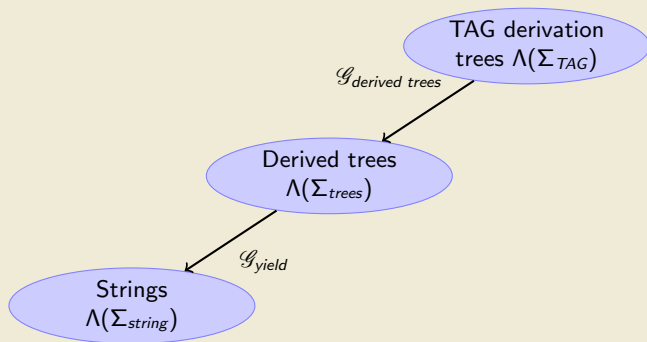
## TAG as ACGs



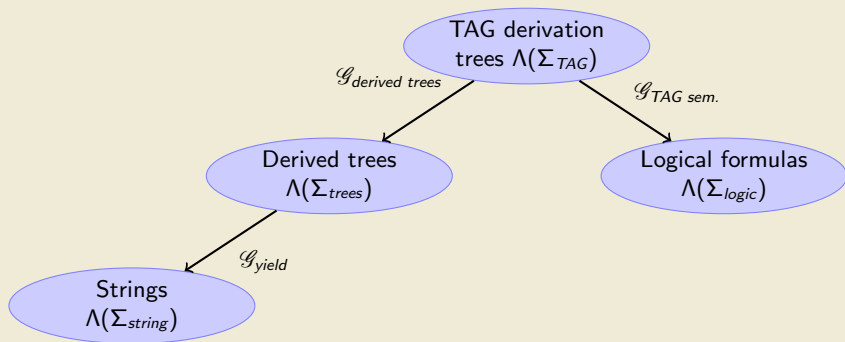
## TAG as ACGs



## TAG as ACGs



# TAG as ACGs + Montague semantics (Pogodalla, 2004)



## Vocabulary $\Sigma_{\text{logic}}$ for Montague semantics

fred :  $e$

laugh :  $e \multimap t$

loudly :  $t \multimap t$

grumpy :  $e \multimap t$

## Vocabulary $\Sigma_{\text{logic}}$ for Montague semantics

fred	: e	loudly	: t $\multimap$ t
laugh	: e $\multimap$ t	grumpy	: e $\multimap$ t
$\wedge$	: t $\multimap$ t $\multimap$ t	$\vee$	: t $\multimap$ t $\multimap$ t
$\Rightarrow$	: t $\multimap$ t $\multimap$ t	$\neg$	: t $\multimap$ t
$\exists$	: (e $\rightarrow$ t) $\multimap$ t	$\forall$	: (e $\rightarrow$ t) $\multimap$ t

# TAG as ACG

Interpretation of TAG derivation trees into Montague semantics

$C_{\text{fred}}$  : NP

$\lambda^{\circ} P. P \text{ fred}$

# TAG as ACG

Interpretation of TAG derivation trees into Montague semantics

$C_{\text{fred}} : \text{NP}$

$\lambda^{\circ} P. P \text{ fred}$

$C_{\text{laugh}} : \text{S}_A \multimap \text{VP}_A \multimap \text{NP} \multimap \text{S}$

$\lambda^{\circ} s_a v_a \text{ subj}. s_a (\text{subj} (v_a (\lambda^{\circ} x. ((\text{lough } x))))))$



# TAG as ACG

## Interpretation of TAG derivation trees into Montague semantics

$C_{\text{fred}} : \text{NP} \quad \lambda^{\circ} P. P \text{ fred}$

$C_{\text{laugh}} : \text{S}_A \multimap \text{VP}_A \multimap \text{NP} \multimap \text{S} \quad \lambda^{\circ} s_a v_a \text{ subj}. s_a (\text{subj} (v_a (\lambda^{\circ} x. ((\text{lough } x))))))$

$C_{\text{loudly}} : \text{VP}_A \multimap \text{VP}_A \quad \lambda^{\circ} vp_a r. vp_a (\lambda^{\circ} x. \text{loudly } (rx))$

$I_{X_A} \quad \lambda x. x$

# TAG as ACG

Interpretation of TAG derivation trees into Montague semantics

$C_{\text{fred}} : \text{NP} \quad \lambda^{\circ} P. P \text{ fred}$

$C_{\text{laugh}} : \text{S}_A \multimap \text{VP}_A \multimap \text{NP} \multimap \text{S} \quad \lambda^{\circ} s_a v_a \text{ subj}_e. s_a (\text{subj}_e (v_a (\lambda^{\circ} x. ((\text{laugh } x))))))$

$C_{\text{loudly}} : \text{VP}_A \multimap \text{VP}_A \quad \lambda^{\circ} v p_a r. v p_a (\lambda^{\circ} x. \text{loudly } (rx))$

$I_{X_A} \quad \lambda x. x$

## Example

Fred loudly laughs.

$\mathcal{L}_{\text{TAG}}^{\text{sem}}(C_{\text{laugh}} I_{S_A} (C_{\text{loudly}} I_{VP_A}) C_{\text{Fred}}) \rightarrow_{\beta} \text{loudly } (\text{laugh Fred}) : t$

# Outline

## 1 TAG

## 2 Discourse formalisms

- Properties of grammars of D-LTAG, G-TAG, D-STAG
- Discourse parsing
- Problem of clause-medial connectives & a possible analysis
- D-STAG

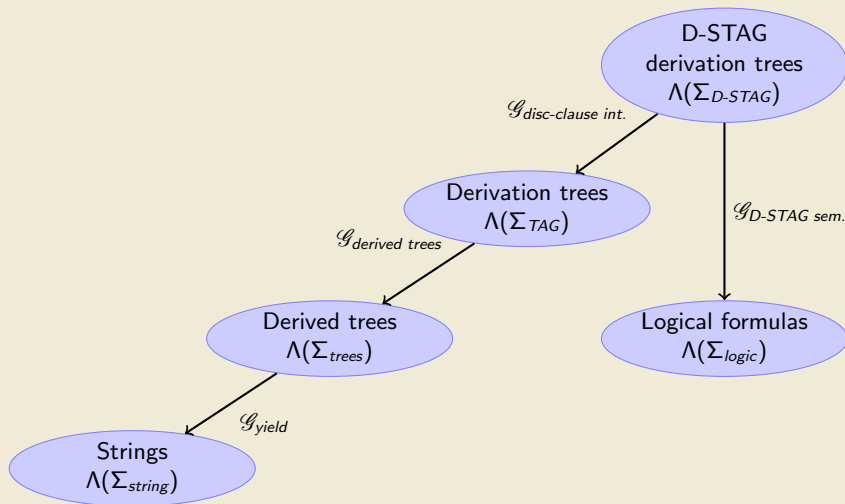
## 3 ACG

- Definition & basic properties
- TAG as ACG
- TAG with semantics as ACG

## 4 **D-STAG as ACG**

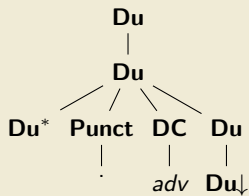
- D-STAG as ACGs + clause-medial connectives
- D-STAG as ACGs with labeled semantics

## D-STAG as ACGs



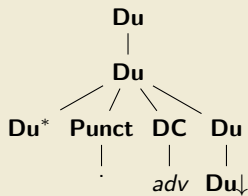
## Discourse grammar with ACGs

Adverbial Connectives :



## Discourse grammar with ACGs

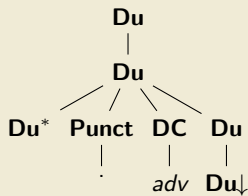
Adverbial Connectives :



$d_{then}$ :  $\mathbf{Du}_A \circ \mathbf{Du}_A \circ \mathbf{Du}_A \circ \mathbf{Du} \circ \mathbf{Du}_A$

## Discourse grammar with ACGs

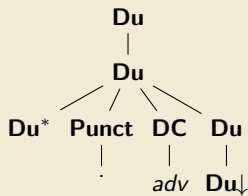
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Adverbial Connectives :

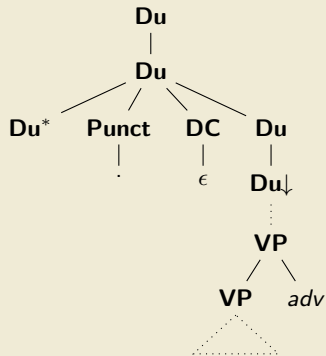
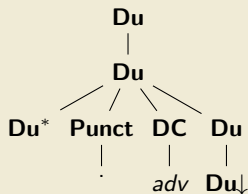


$d_{then}$ :  $\mathbf{Du}_A \circ \mathbf{Du}_A \circ \mathbf{Du}_A \circ \mathbf{Du} \circ \mathbf{Du}_A$



# Discourse grammar with ACGs

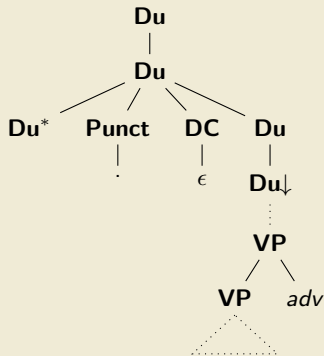
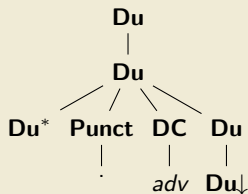
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Adverbial Connectives :

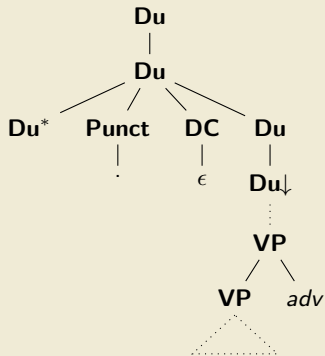
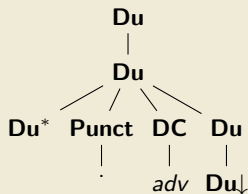


$d_{then} : \mathbf{Du}_A \circ \mathbf{Du}_A \circ \mathbf{Du}_A \circ \mathbf{Du} \circ \mathbf{Du}_A$

$d_{then}^V : \mathbf{Du}_A \circ \mathbf{Du}_A \circ \mathbf{Du}_A \circ (\mathbf{VP}_A \circ \mathbf{Du}) \circ \mathbf{Du}_A$

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Adverbial Connectives :

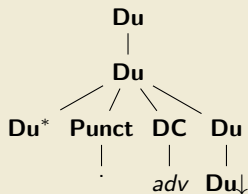


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Adverbial Connectives :



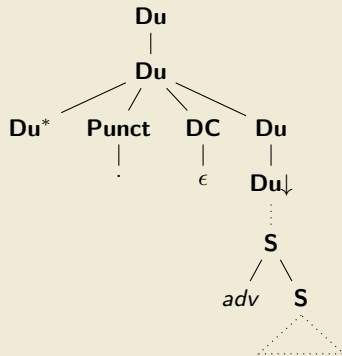
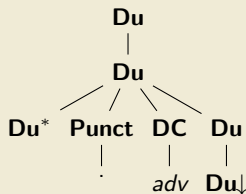
$d_{then}^I: \text{Du}_A \circ \text{Du}_A \circ \text{Du}_A \circ \text{Du} \circ \text{Du}_A$

$d_{then}^V: \text{Du}_A \circ \text{Du}_A \circ \text{Du}_A \circ (\text{VP}_A \circ \text{Du}) \circ \text{Du}_A$

$d_{then}^S$

# Discourse grammar with ACGs

Adverbial Connectives :



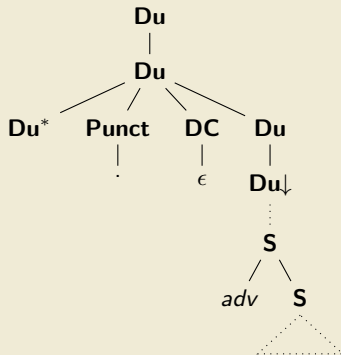
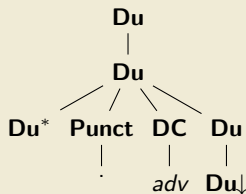
$d_{then}^1: \mathbf{Du}_A \circ \mathbf{Du}_A \circ \mathbf{Du}_A \circ \mathbf{Du} \circ \mathbf{Du}_A$

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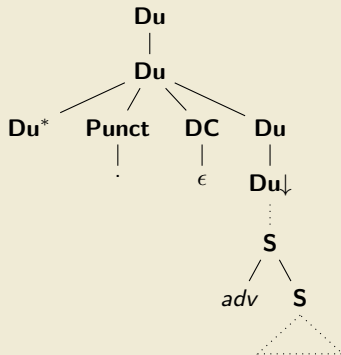
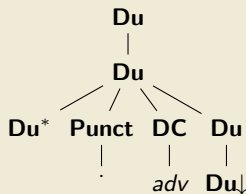
Adverbial Connectives :



$$\begin{aligned}
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 d_{then}^S &: \mathbf{Du}_A \circ \mathbf{Du}_A \circ \mathbf{Du}_A \circ (\mathbf{S}_A \circ \mathbf{Du}) \circ \mathbf{Du}_A
 \end{aligned}$$

# Discourse grammar with ACGs

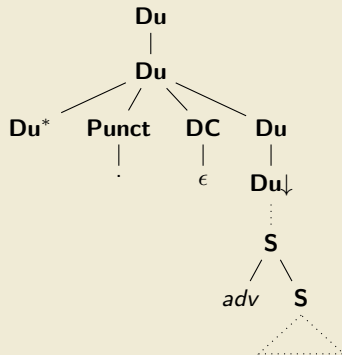
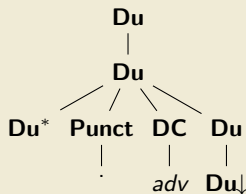
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# Discourse grammar with ACGs

Adverbial Connectives :



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$$d_{then}^V: \mathbf{Du}_A \multimap \mathbf{Du}_A \multimap \mathbf{Du}_A \multimap (\mathbf{VP}_A \multimap \mathbf{Du}) \multimap \mathbf{Du}_A$$

$$d_{then}^S: \mathbf{Du}_A \multimap \mathbf{Du}_A \multimap \mathbf{Du}_A \multimap (\mathbf{S}_A \multimap \mathbf{Du}) \multimap \mathbf{Du}_A$$

3rd order ACG – no polynomial parsing property!



# D-STAG as ACGs

2nd order ACGs

# D-STAG as ACGs

2nd order ACGs

From D-STAG derivation trees to TAG derivation trees

$\text{Du} := \text{S}_A \multimap \text{VP}_A \multimap \text{S}$

# D-STAG as ACGs

2nd order ACGs

From D-STAG derivation trees to TAG derivation trees

$Du := S_A \multimap VP_A \multimap S$

$(DC \triangleq Du_A \multimap Du_A \multimap Du_A \multimap Du \multimap Du_A)$

# D-STAG as ACGs

## 2nd order ACGs

### From D-STAG derivation trees to TAG derivation trees

$Du := S_A \multimap VP_A \multimap S$

$(DC \triangleq Du_A \multimap Du_A \multimap Du_A \multimap Du \multimap Du_A)$

$d_{then}^S : DC \quad := \lambda^o d_1 d_2 d_3 d_u. \text{cons } d_1 d_2 d_3 (d_u C_{then}^S l_{VP})$

# D-STAG as ACGs

## 2nd order ACGs

### From D-STAG derivation trees to TAG derivation trees

$\mathbf{Du} := \mathbf{S}_A \multimap \mathbf{VP}_A \multimap \mathbf{S}$

$(\mathbf{DC} \triangleq \mathbf{Du}_A \multimap \mathbf{Du}_A \multimap \mathbf{Du}_A \multimap \mathbf{Du} \multimap \mathbf{Du}_A)$

$d_{then}^S: \mathbf{DC} \quad := \lambda^0 d_1 d_2 d_3 d_u. \text{ cons } d_1 d_2 d_3 (d_u C_{then}^S \text{ lvp})$

$d_{then}^V: \mathbf{DC} \quad := \lambda^0 d_1 d_2 d_3 d_u. \text{ cons } d_1 d_2 d_3 (d_u \text{ ls } C_{then}^{VP})$

# D-STAG as ACGs

## 2nd order ACGs

### From D-STAG derivation trees to TAG derivation trees

$\mathbf{Du} := \mathbf{S}_A \multimap \mathbf{VP}_A \multimap \mathbf{S}$

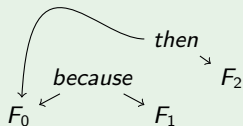
$(\mathbf{DC} \triangleq \mathbf{Du}_A \multimap \mathbf{Du}_A \multimap \mathbf{Du}_A \multimap \mathbf{Du} \multimap \mathbf{Du}_A)$

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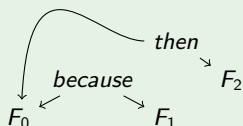
## D-STAG as ACGs – semantic interpretations

(4) [Fred went to a supermarket]<sub>0</sub> because [his fridge was empty]<sub>1</sub>. Then, [he went to movies]<sub>2</sub>.



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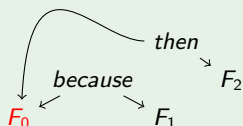
## D-STAG as ACGs

(EXPLANATION  
     $(\exists!x. (\text{supermarket } x) \wedge (\text{go-to fred } x))$   
     $(\exists!x. (\text{fridge } x) \wedge (\text{empty } x))$ )  
 $\wedge$   
(NARRATION  
     $(\exists!x. (\text{supermarket } x) \wedge (\text{go-to fred } x))$   
     $(\exists!x. (\text{movies } x) \wedge (\text{go-to fred } x))$ )



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## D-STAG as ACGs

(EXPLANATION

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$(\exists!x. (\text{fridge } x) \wedge (\text{empty } x))$ )

$\wedge$

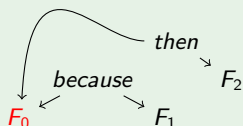
(NARRATION

$(\exists!x. (\text{supermarket } x) \wedge (\text{go-to fred } x))$

$(\exists!x. (\text{movies } x) \wedge (\text{go-to fred } x))$ )

## D-STAG as ACGs – semantic interpretations

(4) [Fred went to a supermarket]<sub>0</sub> because [his fridge was empty]<sub>1</sub>. Then, [he went to movies]<sub>2</sub>.



## D-STAG as ACGs – How to express that the two are the same?

(EXPLANATION

$(\exists!x. (\text{supermarket } x) \wedge (\text{go-to fred } x))$

$(\exists!x. (\text{fridge } x) \wedge (\text{empty } x)))$

$\wedge$

(NARRATION

$(\exists!x. (\text{supermarket } x) \wedge (\text{go-to fred } x))$

$(\exists!x. (\text{movies } x) \wedge (\text{go-to fred } x)))$

# Labeled semantic interpretations

$\Sigma_{\text{logic}}^{\ell}$  - a signature for labeled semantics

Atomic types :  $\{e, t, \ell\}$

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$\Sigma_{\text{logic}}^{\ell}$  - a signature for labeled semantics

Atomic types :  $\{e, t, \ell\}$

Predicates have one additional argument of type  $\ell$  for labels

## Labeled semantic interpretations

$\Sigma_{\text{logic}}^{\ell}$  - a signature for labeled semantics

Atomic types :  $\{e, t, \ell\}$

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Argument of discourse relations are of type  $\ell$  (labels)

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fred, he :  $e$

sleep, bad-mood, exam :  $e \rightarrow \ell \rightarrow t$

love, miss, fail :  $e \rightarrow e \rightarrow \ell \rightarrow t$

$\forall, \exists, \exists!$  :  $(e \rightarrow t) \rightarrow t$

...

EXPLANATION :  $\ell \rightarrow \ell \rightarrow \ell \rightarrow t$

CONTINUATION :  $\ell \rightarrow \ell \rightarrow \ell \rightarrow t$

NARRATION :  $\ell \rightarrow \ell \rightarrow \ell \rightarrow t$

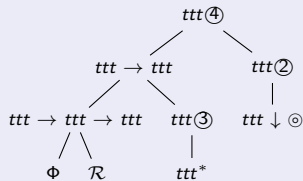
$\exists_l$  :  $(\ell \rightarrow t) \rightarrow t$

...

## Labeled semantic trees

Unlabeled

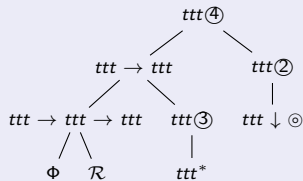
$(t \rightarrow t) \rightarrow t \triangleq ttt$



$$\Phi'' \mathcal{R} = \lambda X. \lambda Y. \lambda P. X(\lambda x. (Y(\lambda y. (\mathcal{R} x y) \wedge P(x))))$$

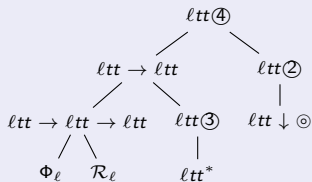
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$$\Phi_l'' \mathcal{R}_l = X Y P. \exists_l I. X(\lambda x. Y(\lambda y. (P x) \wedge (\mathcal{R}_l x y I)))$$

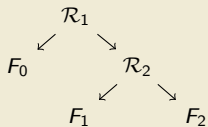


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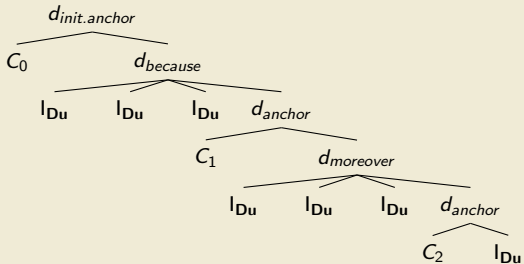
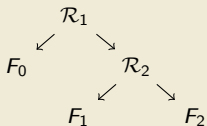
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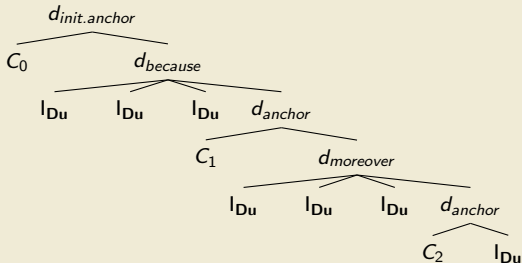
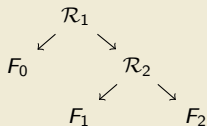
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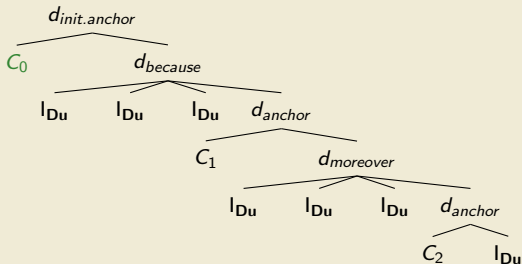
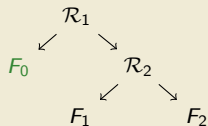
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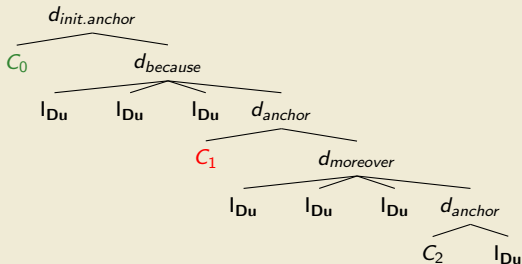
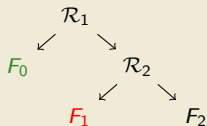
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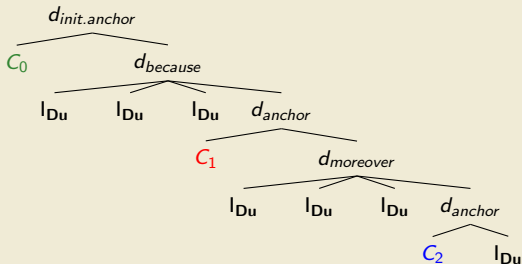
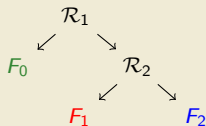
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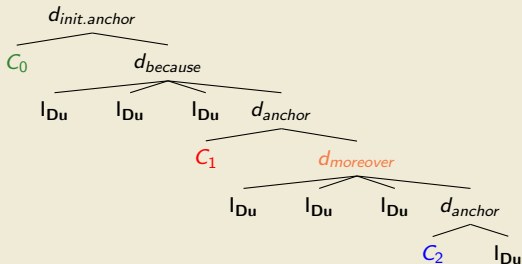
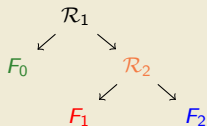
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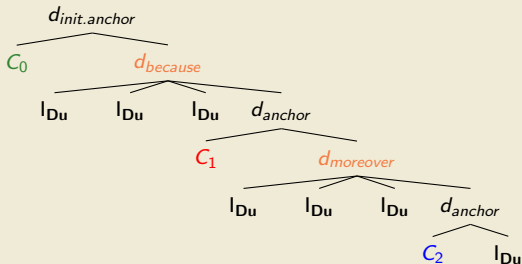
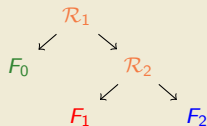


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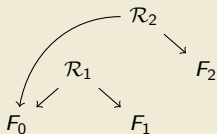
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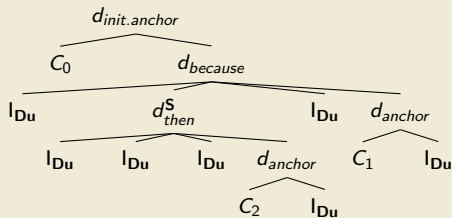
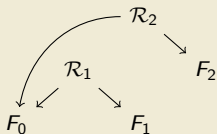
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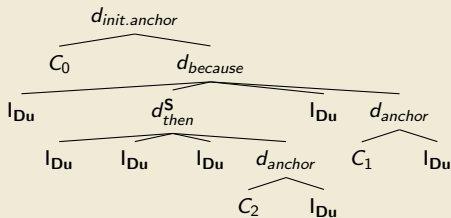
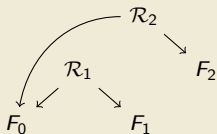
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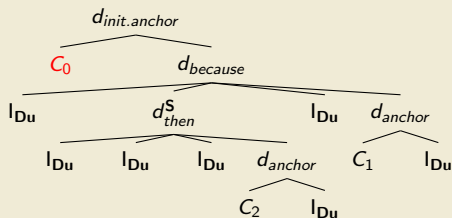
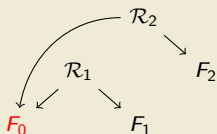
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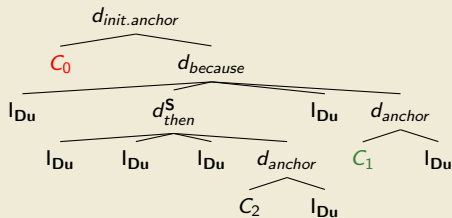
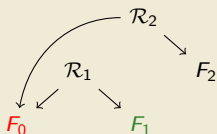
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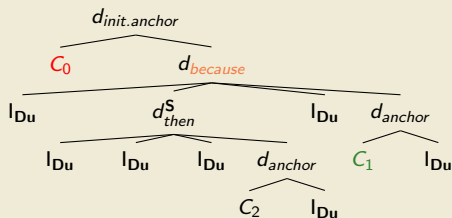
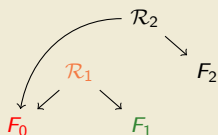
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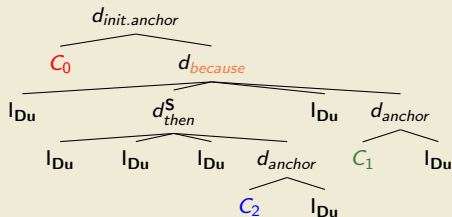
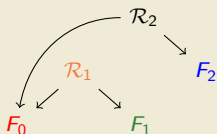


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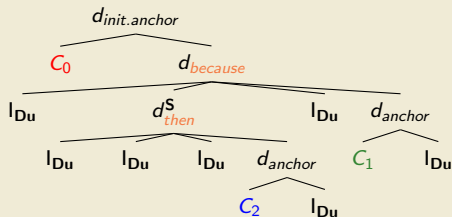
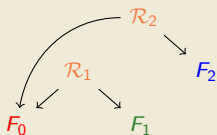
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Thank you !

## References I

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