

A Step towards Natural-Sounding Speech Generation

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Natural Speech vs. Computer Speech

- ◆ Text-to-speech vs. content-to-speech
- ◆ Formant synthesis (rule-based synthesis)
 - an acoustic model.
 - parameters: fundamental frequency, voicing, and noise levels varied over time to create a waveform of artificial speech (Bell Labs 63) 
- ◆ Articulatory synthesis
 - computational models of the human vocal tract; the articulation processes occurring there
 - mostly of academic interest
- ◆ Concatenative Synthesis
 - concatenation (or stringing together) of segments of recorded speech
 - generally the most natural sounding synthesized speech
 - but sometimes audible glitches in the output, detracting from the naturalness of the synthesized speech

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Natural Speech vs. Computer Speech

◆ Examples of concatenative speech

■ AT&T: US   UK  IN 

I like **all** kinds of ice cream.

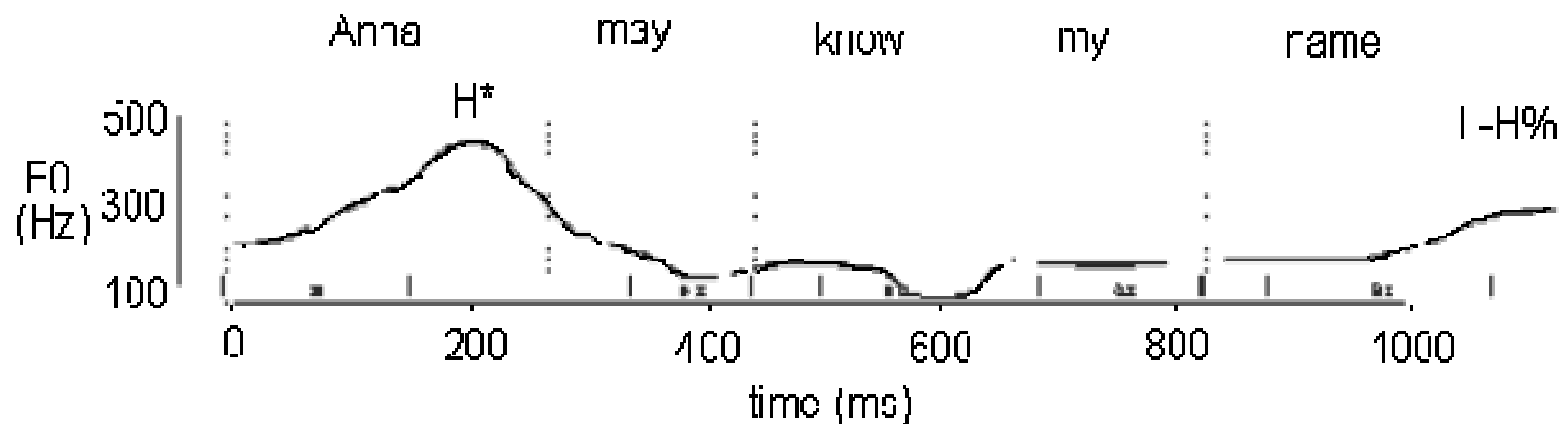
Usually **chocolate** flavour is my favourite, but
sometimes simple **vanilla** ice cream is even **better**.

Which one do **you** like better: **chocolate** or **vanilla** ice
cream?

■ Institute of Cybernetics at TTU: EST 

Intonation

- ◆ Intonation, prosody, speech melody
- ◆ Intonation contour: F0 contour
 - The fundamental tone: the lowest frequency in a harmonic series. In addition to F0 there are overtones (faster waves).



Pierrehumbert's System of Prosodic Elements (mod.)

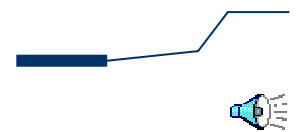
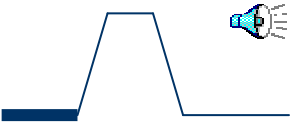
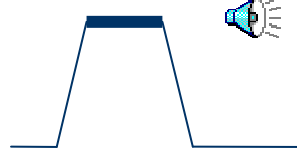
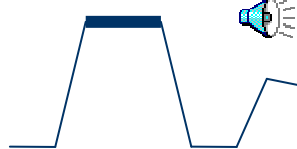
◆ Pitch accents

- On words: makes words stand out, emphasises them
 - H*, L*, L+H*, L*+H, H+L*, H*+L, H*+H

◆ Boundary tones

- At the end of prosodic phrases
 - LL%, LH%, HH%, HL%

Prosodic Elements Contd.

	LL%	LH%	HL%	HH%
H*			 	 
L*	 	 		 
L*+H	 	 		
L+H*	 	 		



Information Structure

- Aristotle taught young ALEXANDER.
- * ARISTOTLE taught young Alexander.

Information Structure

- Who did Aristotle teach?
- Aristotle taught young ALEXANDER
- * ARISTOTLE taught young Alexander.

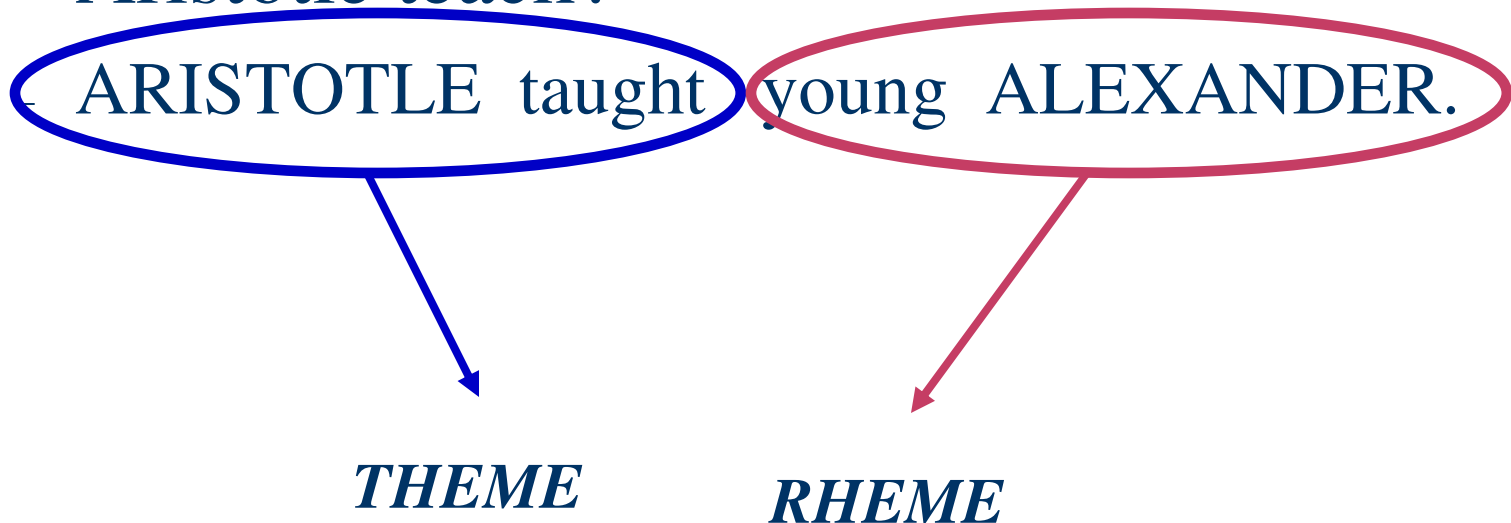
THEME

FOCUS

RHEME

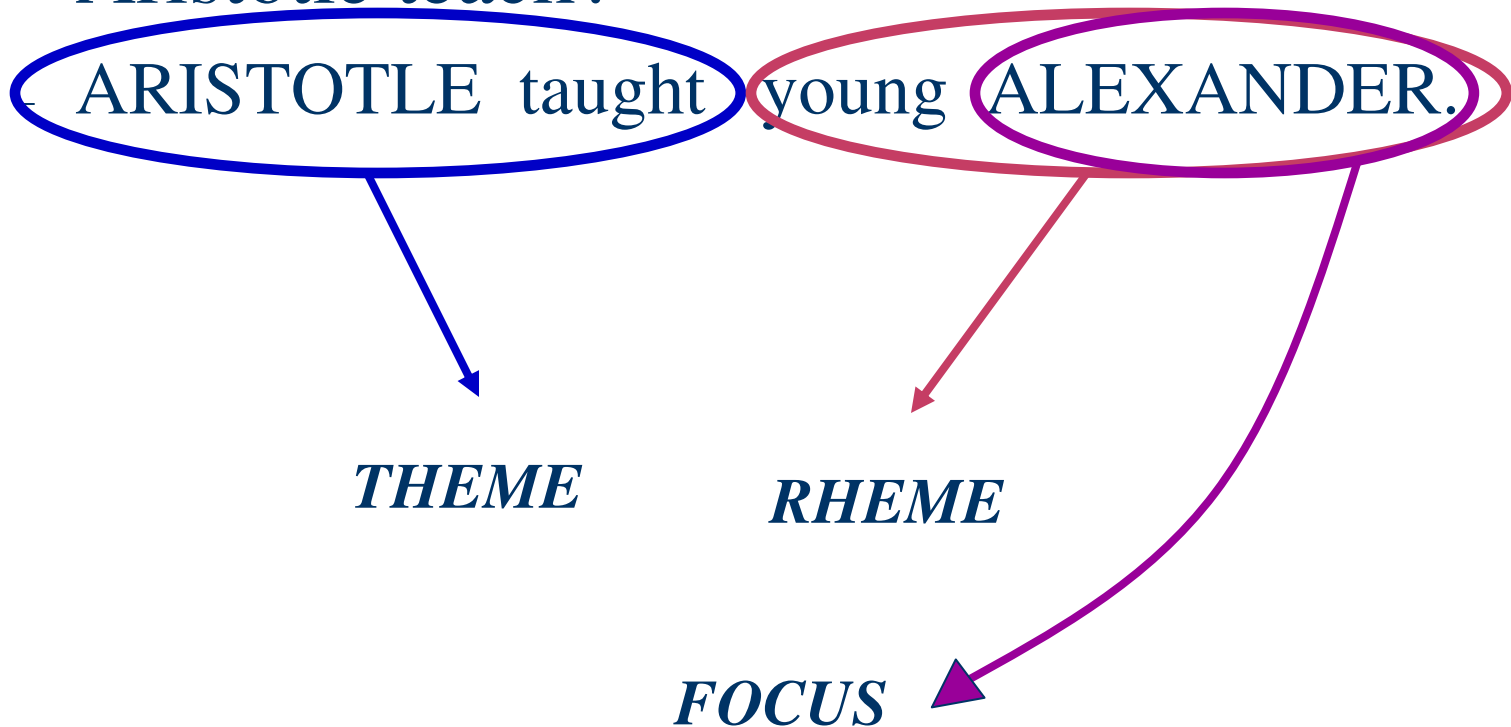
Information Structure

- I know who you teach, but who did Aristotle teach?



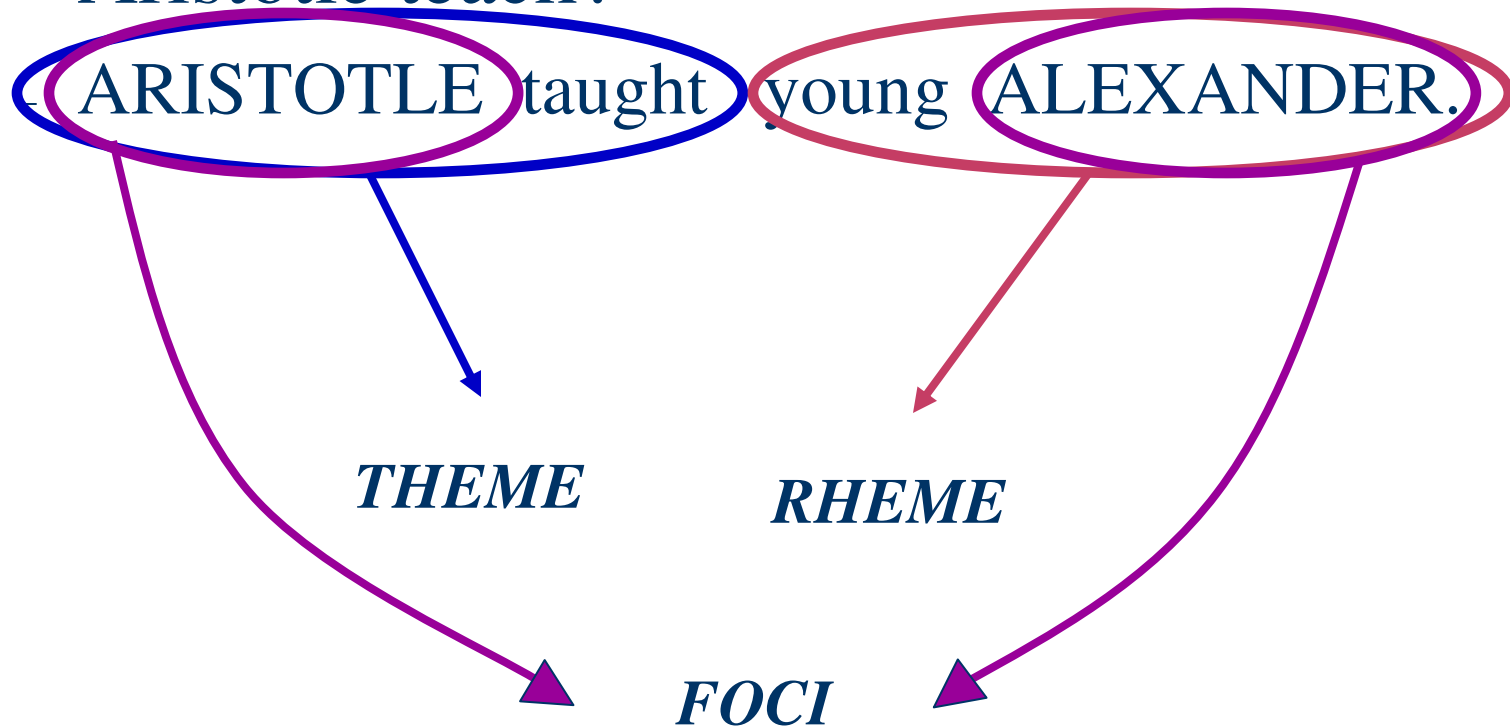
Information Structure

- I know who you teach, but who did Aristotle teach?



Information Structure

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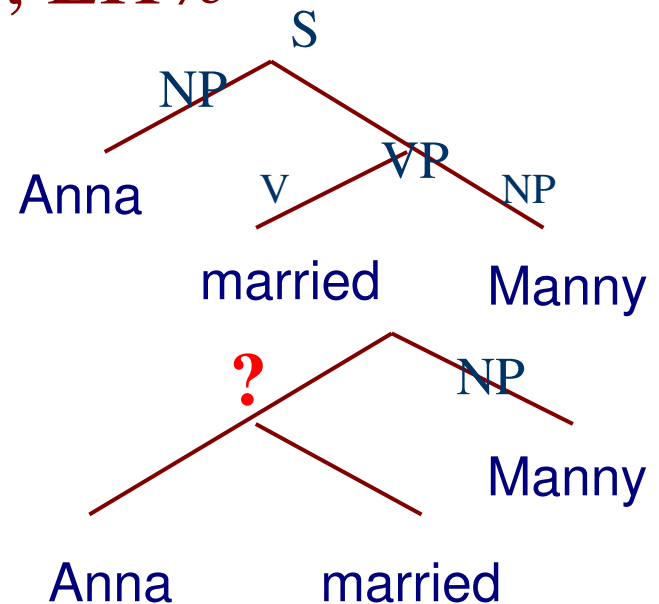


Steedman's Prosodic Approach to Information Structure

- ◆ Theme pitch accents, e.g. $L+H^*$
- ◆ Rheme pitch accents, e.g. H^*
- ◆ Boundary tones, e.g. $LL\%$, $LH\%$

■ *Anna married Manny.*
 $H^* LL\%$ $L+H^* LH\%$

■ *Anna married Manny.*
 $L+H^* LH\% H^* LL\%$



Discourse Representation Theory (DRT)

◆ Discourse Representation Structure (DRS):

- Universe: discourse referents
- Discourse conditions

Anna likes ice cream. She eats it often.

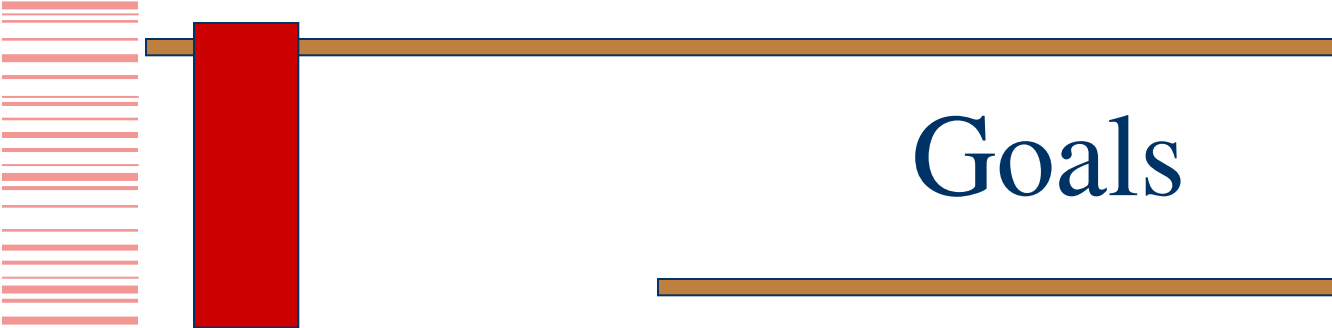
X	Y	E
anna(X)		
female(X)		
like(E)		
ice_cream(Y)		
thing(Y)		
agent(E,X)		
patient(E,Y)		



Z	W	E ₁
Z=?		
female(?)		
eat(E ₁)		
W=? ₁		
thing(? ₁)		
agent(E ₁ ,Z)		
patient(E ₁ ,W)		
often(E ₁)		



X	Y	Z	W	E	E ₁
anna(X)					
female(X)					
like(E)					
ice_cream(Y)					
thing(Y)					
agent(E,X)					
patient(E,Y)					
Z=X					
W=Y					
eat(E ₁)					
agent(E ₁ ,Z)					
patient(E ₁ ,W)					
often(E ₁)					



Goals



- ◆ Combine

- information structure
- DRT semantics

} IS-DRS

- ◆ Provide a mechanism to get from

- an intonationally annotated text to our semantic representation marked with information structure, and vice versa

Our approach: IS-DRS

- ◆ Information structure flags on discourse conditions
- ◆ Suitable both for natural language generation and automatic inference

Anna H* LL% married
Manny L+H* LH%.

theme θ
rheme ρ
focus $+/-$

X,Y,E	
anna(X)	$\rho+$
manny(Y)	$\theta+$
marry(E)	$\theta-$
agent(E,X)	
patient(E,Y)	

Categorial Grammars

- ♦ Grammar: lexicon and rules for constructing more complex structures from simpler ones
- ♦ Categorial Grammars:
 - Lexicalised theories of grammar
 - Category – functional type associated with an entry in the lexicon

man :- n

a :- np/n

- ♦ Combinatory rules

$$\frac{a}{np/n} \quad \frac{man}{n} \Rightarrow \frac{a \ man}{np}$$

Combinatory Categorical Grammar (CCG)

◆ Categories

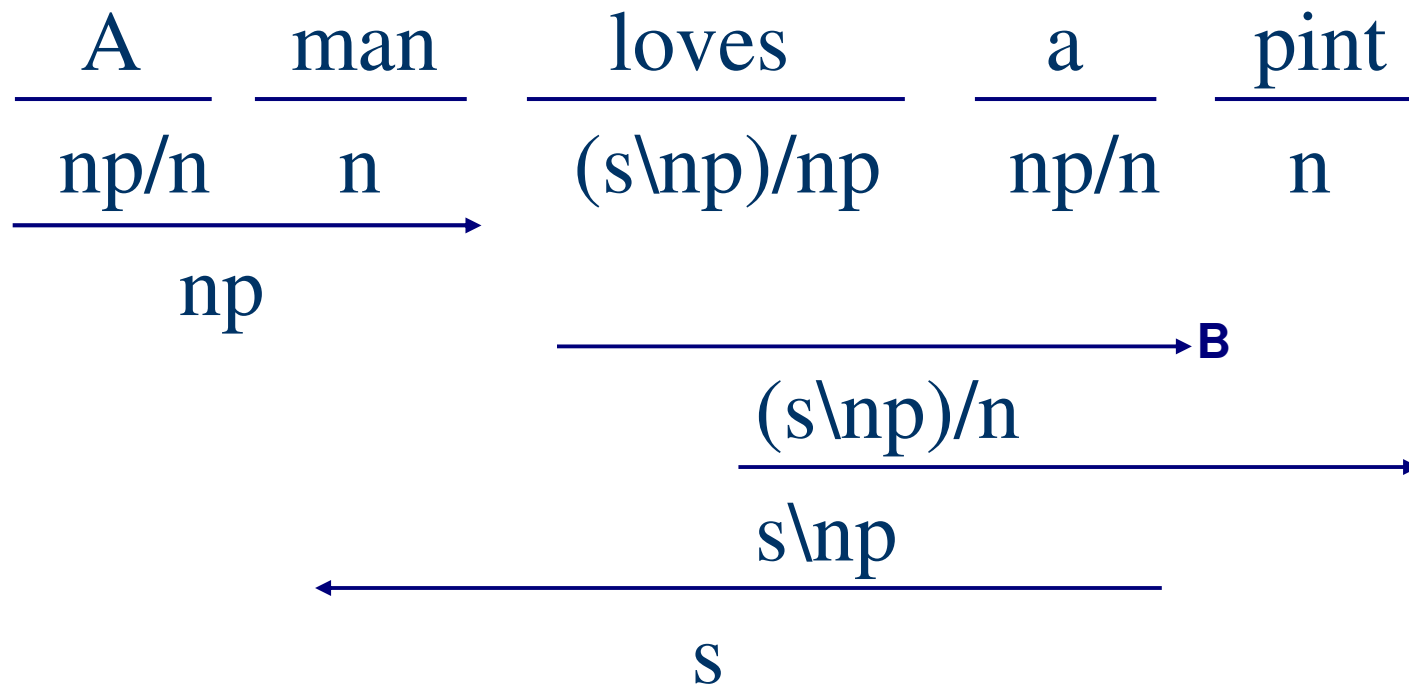
- Basic categories: s , n , np
- Complex categories: $s \backslash np$, np / n , $(n \backslash n) / (s \backslash np)$
 - Directional slashes: $\backslash$ and $/$

◆ Combinatory rules:

- Forward application: $X / Y \ Y \rightarrow X$
- Backward application: $Y \ X \backslash Y \rightarrow X$
- Forward composition: $X / Y \ Y / Z \rightarrow X / Z$
- Backward composition: $Y \backslash Z \ X \backslash Y \rightarrow X \backslash Z$
- Etc.



Combinatory Categorical Grammar



Unification Categorical Grammar

- ◆ Unification
- ◆ Feature structures called signs
- ◆ Forward and backward application

LOVE

sent[fin]/ W_1 :np:x:pre/ W_2 :np:y:post

[e]love(e,x,y)

O

Unification-based Combinatory Categorial Grammar

- ◆ Combinatory rules
- ◆ Directional slashes
- ◆ Unification
- ◆ Signs
- ◆ Compositional semantics
- ◆ Basic categories: s, n, vp
- ◆ DRT semantics (1st order)
- ◆ Information structure in semantics

CCG

UCG



Signs

◆ Basic signs

PHO: child

CAT: n

VAR: X

DRS:

child(X)

◆ Complex sign

PHO: every+W1+W2

CAT: s

DRS:

X

;D1→D2

PHO: W2

CAT: vp

AGR: fin

VAR: X

DRS: D2

PHO: W1

CAT: n

VAR: X

DRS: D1

Combining of Signs

PHO: every+W1+W2

CAT: s

DRS:

X

;D1→D2

PHO: W2

CAT: vp

AGR: fin

VAR: X

DRS: D2

PHO: W1

CAT: n

VAR: X

DRS: D1

PHO: child

CAT: n

VAR: Y

DRS:

child(Y)

PHO: every+child+W2

CAT: s

DRS:

X
child(X)

→ D2

PHO: W2

CAT: vp

AGR: fin

VAR: X

DRS: D2

Theme and Rheme in UCCG

- ◆ Themeness or rhemeness of a lexical item depends on the type of pitch accent that occurs on it
- ◆ If no pitch accent on the item, its information structure value is a variable → gets its value from a marked item with which the current item is combined
 - theme marked item can only combine with
 - another theme marked item
 - an unmarked item
 - rheme marked item can only combine with
 - another rheme marked item
 - an unmarked item

Information Structure in UCCG Feature Structures

◆ INF feature

theme, rheme, phrase

◆ FOC feature

- + the word carries a pitch accent
- – the word does not have a pitch accent on it

PHO: manny + W					
CAT: s					
INF: I					
FOC: F					
DRS:	<table><tr><td>X</td><td>⊗D</td></tr><tr><td>Manny(X) I F</td><td></td></tr></table>	X	⊗D	Manny(X) I F	
X	⊗D				
Manny(X) I F					

/

PHO: W	
CAT: vp	
VAR: X	
SIT: E	
INF: I	
FOC: F	
DRS: D	

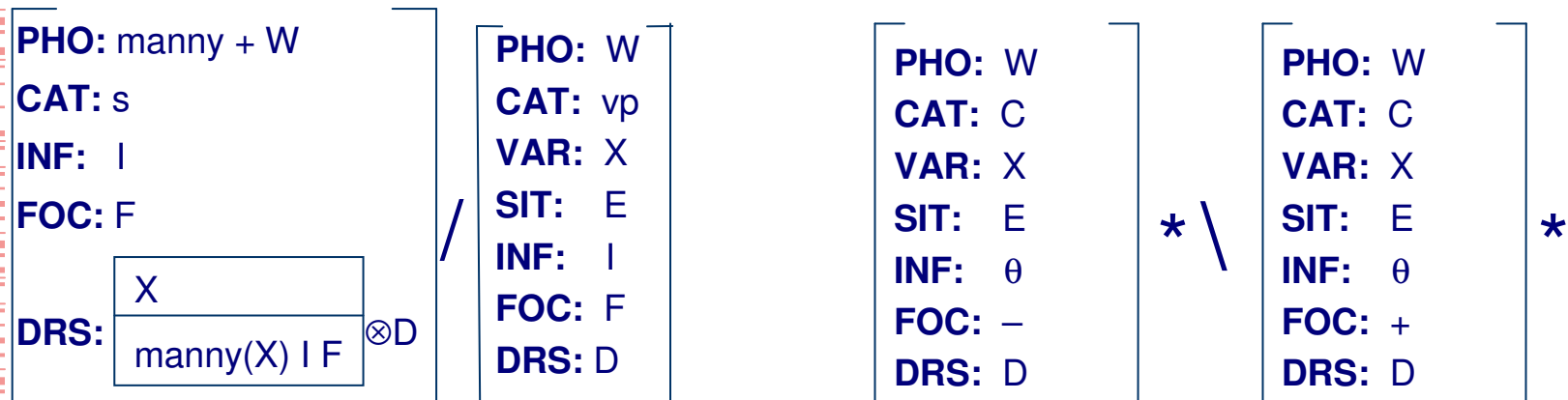
Pitch Accent

- ◆ Appears as an individual lexical item
- ◆ Copies the sign on its left, and instantiates the information structure feature value to theme (θ) or rheme (ρ)
- ◆ Via unification marks the semantics of the lexical item as being focused (+) (different values in active & result parts)

$$H^* \left[\begin{array}{l} \text{PHO: W} \\ \text{CAT: C} \\ \text{VAR: X} \\ \text{SIT: E} \\ \text{INF: } \rho \\ \text{FOC: -} \\ \text{DRS: D} \end{array} \right] * \setminus \left[\begin{array}{l} \text{PHO: W} \\ \text{CAT: C} \\ \text{VAR: X} \\ \text{SIT: E} \\ \text{INF: } \rho \\ \text{FOC: +} \\ \text{DRS: D} \end{array} \right] *$$

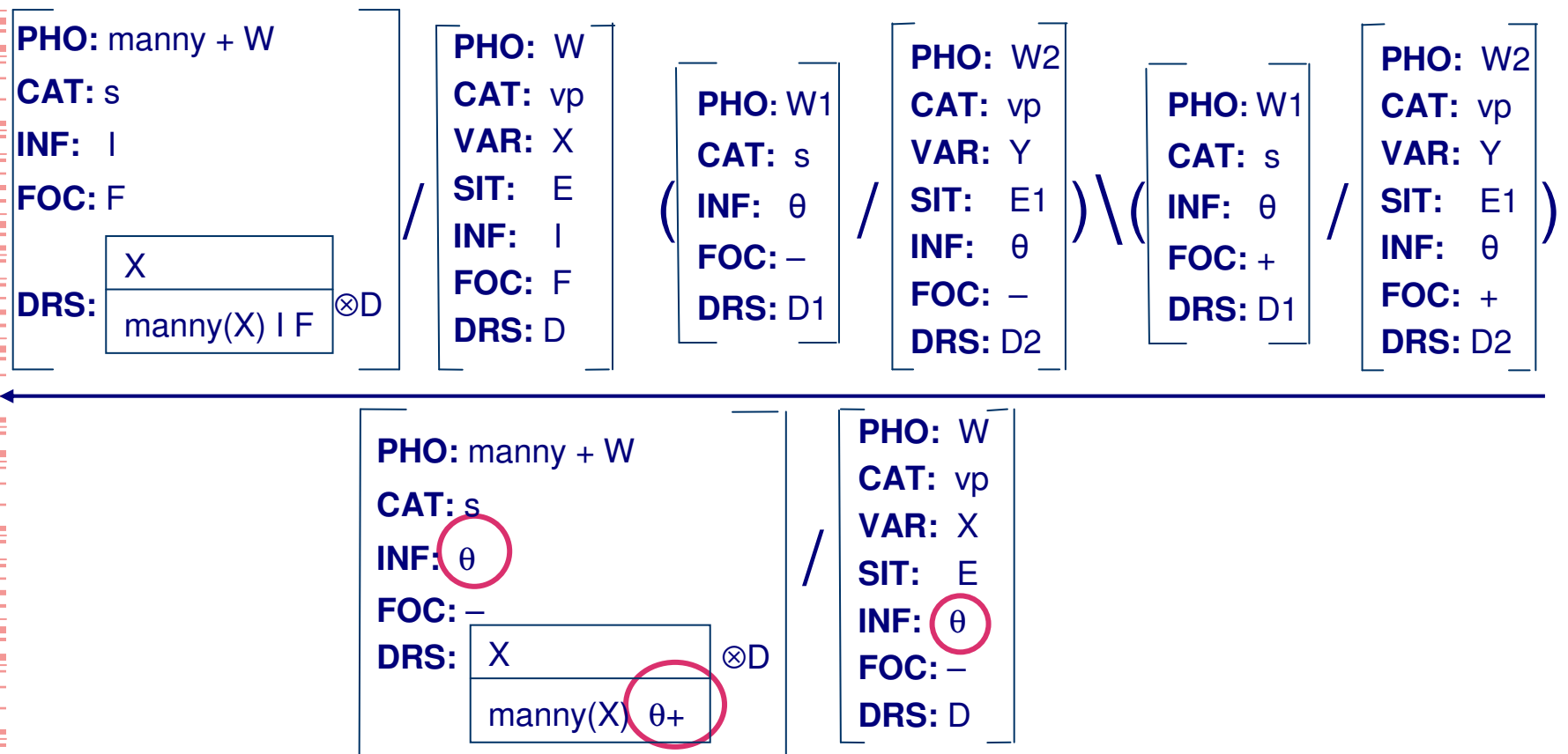
Combining with a Pitch Accent

◆ Manny L+H*



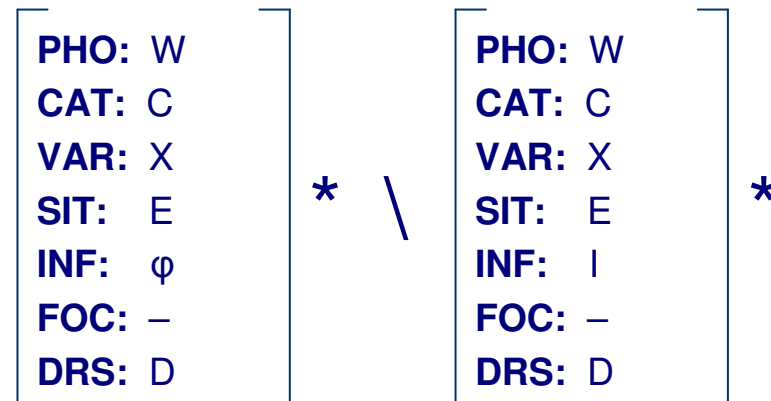
Combining with a Pitch Accent

◆ Manny L+H*



Boundary Tones

- ◆ Boundary tones “freeze” intonational phrases:
cannot combine with anything else but a complete phrase



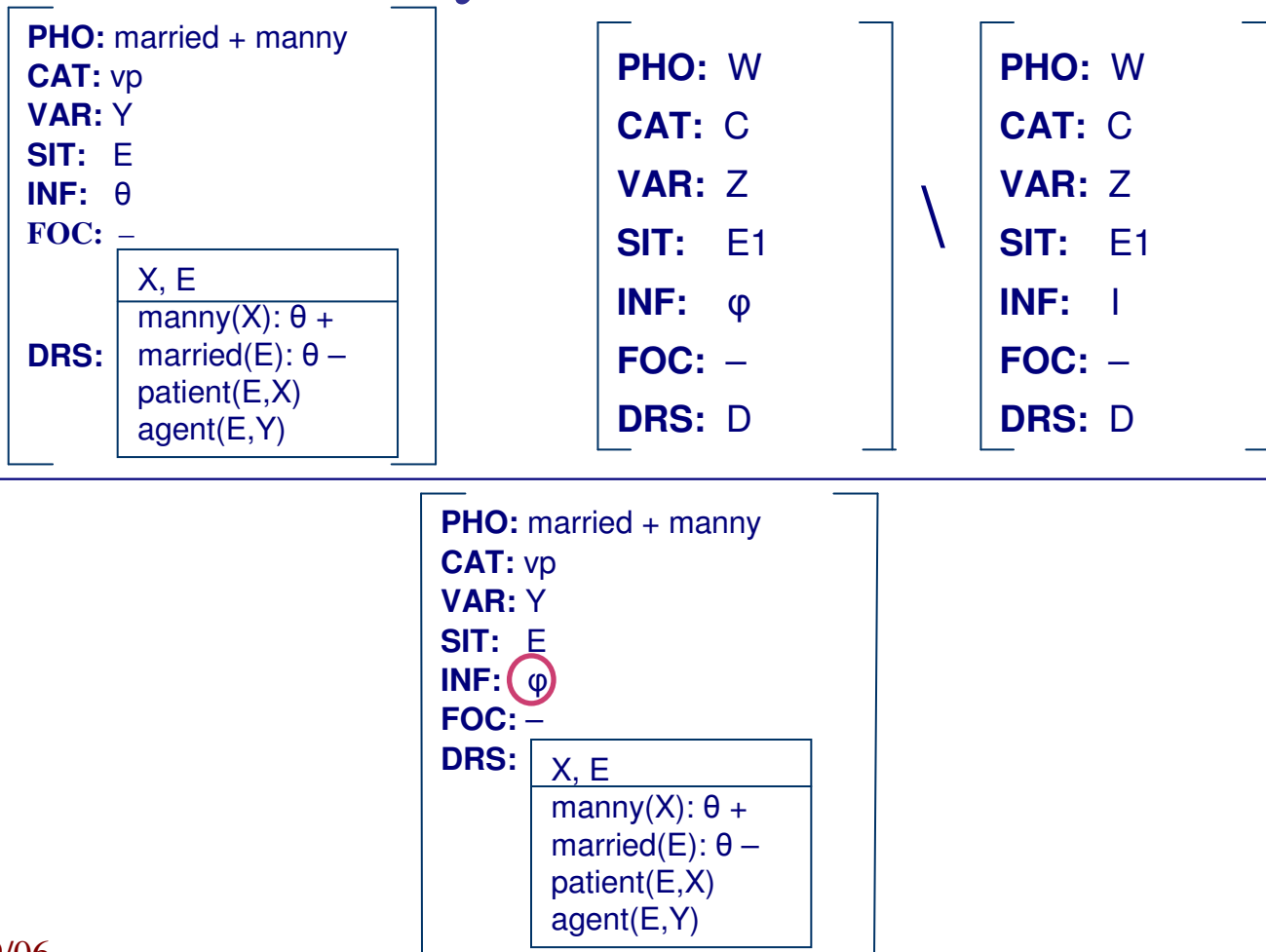
Combining with a Boundary Tone

◆ married Manny L+H* LH%

PHO: married + manny CAT: vp VAR: Y SIT: E INF: $\emptyset$ FOC: – DRS: X, E manny(X): θ + married(E): θ – patient(E,X) agent(E,Y)	PHO: W CAT: C VAR: Z SIT: E1 INF: φ FOC: – DRS: D	PHO: W CAT: C VAR: Z SIT: E1 INF: I FOC: – DRS: D
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Combining with a Boundary Tone

◆ married Manny L+H* LH%



Combining of Full Intonational Phrases

- ◆ Anna H* LL% married Manny L+H* LH%

PHO:	anna + W			
CAT:	s			
INF:	φ			
FOC:	—			
DRS:	<table><tr><td>X</td></tr><tr><td>anna(X) θ+</td></tr></table>	X	anna(X) θ +	$\otimes D$
X				
anna(X) θ +				

PHO: W	
CAT: vp	
VAR: X	
SIT: E1	
INF: φ	
FOC: –	
DRS: D	

PHO:	married + manny					
CAT:	vp					
VAR:	Z					
SIT:	E					
INF:	φ					
FOC:	—					
DRS:	<table><tr><td>X, E</td></tr><tr><td>manny(Y) $\theta +$</td></tr><tr><td>married(E) $\theta -$</td></tr><tr><td>patient(E, Y)</td></tr><tr><td>agent(E, Z)</td></tr></table>	X, E	manny(Y) $\theta +$	married(E) $\theta -$	patient(E, Y)	agent(E, Z)
X, E						
manny(Y) $\theta +$						
married(E) $\theta -$						
patient(E, Y)						
agent(E, Z)						

PHO: anna + married + manny

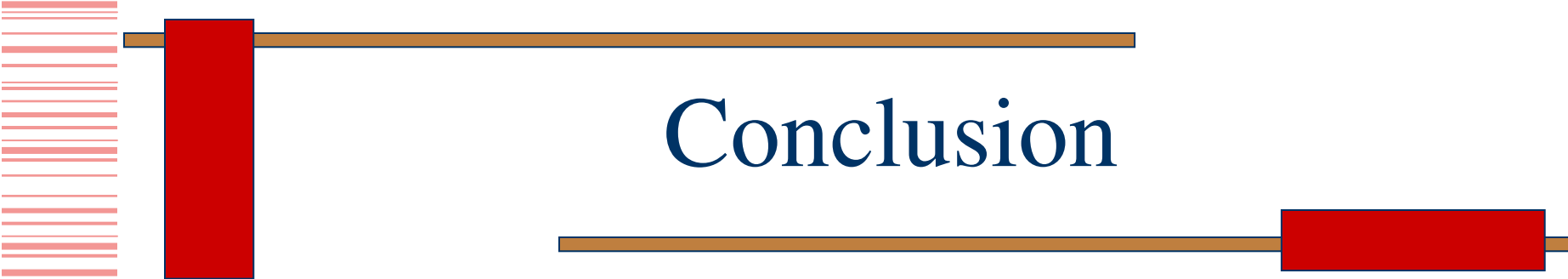
CAT: s

INF: φ

FOC: –

DRS:

X, Y, E	
anna(X)	$\rho +$
manny(Y)	$\theta +$
married(E)	$\theta -$
patient(E, Y)	
agent(E, X)	



Conclusion

- ◆ Integrated DRT, IS and CCG into a single framework
 - IS-DRS
 - DRT combined with a theory of information structure
 - Unification-based Combinatory Categorical Grammar
 - parsing and generating prosodically annotated text
 - compositional analysis of information structure



Future Work

- ◆ Enhance the existing UCCG parser
- ◆ Implement a generation component based on UCCG
- ◆ Use the formalism in existing spoken dialogue systems

For a more complete account see:

<http://www.iccs.inf.ed.ac.uk/~s0129610/thesis.ps.gz>