

# CS 4705: Semantic Analysis: Syntax-Driven Semantics

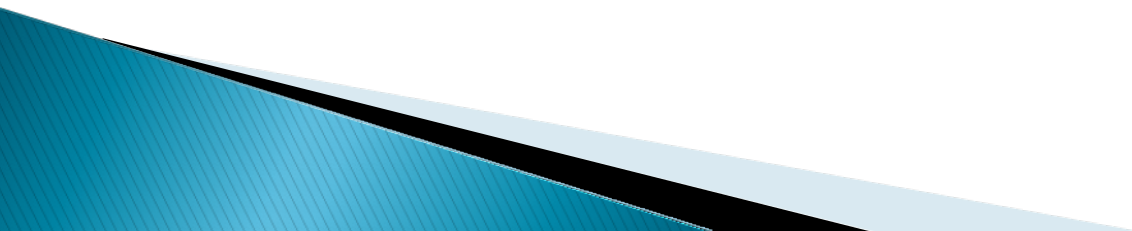
Slides adapted from Julia Hirschberg

# Announcements

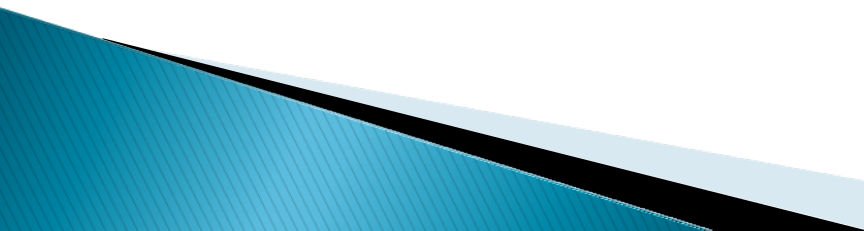
Homework:

Note POS tag corrections. Use POS tags as guide.  
You may change them if they hold you back.

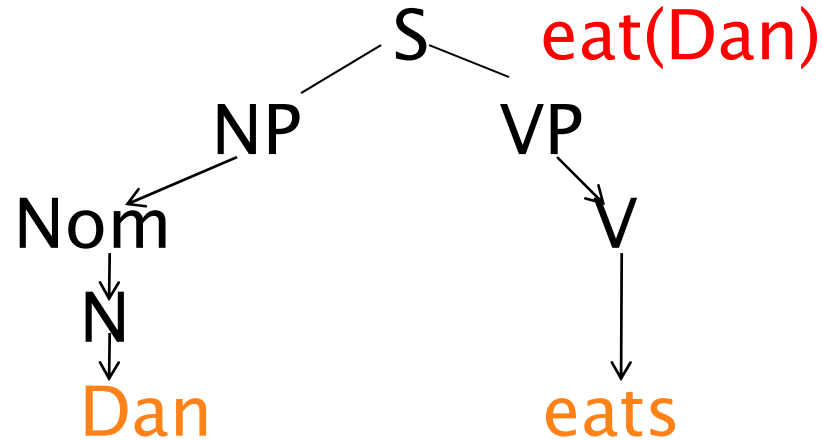
# Today

- ▶ Reading: Ch 17.2–17.4, 18.1–18.7 (cover material through today); Ch 19.1–19.5 (next time)
  - ▶ Semantic Analysis: translation from syntax to FOPC
  - ▶ Hard problems in semantics
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# Meaning derives from

- The entities and actions/states represented (predicates and arguments, or, nouns and verbs)
  - The way they are ordered and related:
    - The **syntax of the representation** may correspond to the **syntax of the sentence**
    - Can we develop a **mapping** between syntactic representations and formal representations of meaning?
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# Syntax-Driven Semantics



- ▶ **Goal:** Link syntactic structures to corresponding semantic representation to produce representation of the 'meaning' of a sentence while parsing it

# Specific vs. General-Purpose Rules

- ▶ *Don't* want to have to specify for every possible parse tree what semantic representation it maps to
- ▶ *Do* want to identify general mappings from parse trees to semantic representations
- ▶ One way:
  - Augment lexicon and grammar
  - Devise mapping between rules of grammar and rules of semantic representation
  - **Rule-to-Rule Hypothesis: such a mapping exists**

# Semantic Attachment

- ▶ Extend every grammar rule with `instructions' on how to map components of rule to a semantic representation, e.g.  
 $S \rightarrow NP VP \{VP.sem(NP.sem)\}$
- ▶ Each semantic function defined in terms of semantic representation of choice
- ▶ **Problem:** how to **define semantic functions** and how to **specify their *composition*** so we always get the `right' meaning representation from the grammar

# Example: McDonalds serves burgers.

- ▶ Associating constants with constituents
  - ProperNoun → McDonalds {McDonalds}
  - PluralNoun → burgers {burgers}
- ▶ Defining functions to produce these from input
  - NP → ProperNoun {ProperNoun.sem}
  - NP → PluralNoun {PluralNoun.sem}
  - **Assumption:** meaning representations of children are passed up to parents when non-branching (e.g. ProperNoun.sem(X) = X)
- ▶ *But...verbs are where the action is*



- $V \rightarrow \text{serves } \{\exists(e,x,y) (\text{Isa}(e,\text{Serving}) \wedge \text{Agent}(e,x) \wedge \text{Patient}(e,y))\}$  where  $e = \text{event}$ ,  $x = \text{agent}$ ,  $y = \text{patient}$
- Will every verb needs its own distinct representation?
  - McDonalds hires students.
    - Predicate(Agent, Patient)
  - McDonalds gave customers a bonus.
    - Predicate(Agent, Patient, Beneficiary)

# Composing Semantic Constituents

- ▶ Once we have the semantics for each constituent, how do we combine them?
  - E.g.  $VP \rightarrow V NP \{V.sem(NP.sem)\}$
  - If goal for VP semantics of 'serve' is the representation  $(\exists e,x) (Isa(e,Serving) \wedge Agent(e,x) \wedge Patient(e,burger))$  then
  - **VP.sem** must tell us
    - Which variables to be replaced by which arguments?
    - How is replacement accomplished?

# First... Lambda Notation

- ▶ Extension to First Order Predicate Calculus

$\lambda x P(x)$ :  $\lambda$  + variable(s) + FOPC expression in those variables

- ▶ **Lambda reduction**

- Apply lambda-expression to logical terms to *bind* lambda-expression's parameters to terms

$\lambda x P(x)$

$\lambda x P(x)(car)$

$P(car)$

# For NLP Semantics

- ▶ **Parameter list** (e.g.  $x$  in  $\lambda x$ ) in lambda expression makes variables ( $x$ ) in logical expression ( $P(x)$ ) available for **binding** to external arguments (**car**) provided by semantics of other constituents
  - $P(x)$ : loves(Mary, $x$ )
  - $\lambda xP(x)$ car: loves(Mary,car)

# Defining VP Semantics

- ▶ Recall we have  $VP \rightarrow V NP \{V.sem(NP.sem)\}$
- ▶ Target semantic representation is:  
 $\{\exists(e,x,y) (Isa(e,Serving) \wedge Agent(e,x) \wedge Patient(e,y))\}$
- ▶ Define **V.sem** as:  
 $\{\lambda y \exists(e,x) (Isa(e,Serving) \wedge Agent(e,x) \wedge Patient(e,y))\}$ 
  - Now 'y' will be available for binding when **V.sem** applied to **NP.sem** of direct object

# V.sem Applied to McDonalds serves burgers

- ▶  $\lambda$  application binds  $x$  to value of NP.sem  
(burgers)

$\lambda y \exists(e,x) (\text{Isa}(e,\text{Serving}) \wedge \text{Agent}(e,x) \wedge$   
 $\text{Patient}(e,y))$  (burgers)

- ▶  $\lambda$ -reduction replaces  $y$  within  $\lambda$ -expression  
with burgers
- ▶ Value of V.sem(NP.sem) is now  $\exists(e,x)$   
 $(\text{Isa}(e,\text{Serving}) \wedge \text{Agent}(e,x) \wedge$   
 $\text{Patient}(e,\text{burgers}))$

# But we're not done yet....

- ▶ Need to define semantics for
  - $S \rightarrow NP VP \{VP.sem(NP.sem)\}$
  - Where is the subject?
  - $\exists(e,x) (Isa(e,Serving) \wedge Agent(e,x) \wedge Patient(e,burgers))$
  - Need another  $\lambda$ -expression in V.sem so the subject NP can be bound later in VP.sem
  - V.sem, version 2
    - $\lambda y \lambda x \exists(e) (Isa(e,Serving) \wedge Agent(e,x) \wedge Patient(e,y))$

- $VP \rightarrow V \ NP \ \{V.sem(NP.sem)\}$   
 $\lambda y \ \lambda x \ \exists(e) \ (Isa(e, Serving) \wedge Agent(e, x) \wedge Patient(e, y))(burgers)$   
 $\lambda x \ \exists(e) \ (Isa(e, Serving) \wedge Agent(e, x) \wedge Patient(e, burgers))$
- $S \rightarrow NP \ VP \ \{VP.sem(NP.sem)\}$   
 $\lambda x \ \exists(e) \ Isa(e, Serving) \wedge Agent(e, x) \wedge Patient(e, burgers)\}(McDonald's)$   
 $\exists(e) \ Isa(e, Serving) \wedge Agent(e, McDonald's) \wedge Patient(e, burgers)$



# What is our grammar now?

$S \rightarrow NP VP \{VP.sem(NP.sem)\}$

$VP \rightarrow V NP \{V.sem(NP.sem)\}$

$V \rightarrow \text{serves} \{\lambda x \lambda y E(e) (\text{Isa}(e, \text{Serving}) \wedge \text{Agent}(e, y) \wedge \text{Patient}(e, x))\}$

$NP \rightarrow \text{Propernoun} \{\text{Propernoun.sem}\}$

$NP \rightarrow \text{Pluralnoun} \{\text{Pluralnoun.sem}\}$

$\text{Propernoun} \rightarrow \text{McDonalds}$

$\text{Pluralnoun} \rightarrow \text{burgers}$

# Parsing with Semantic Attachments

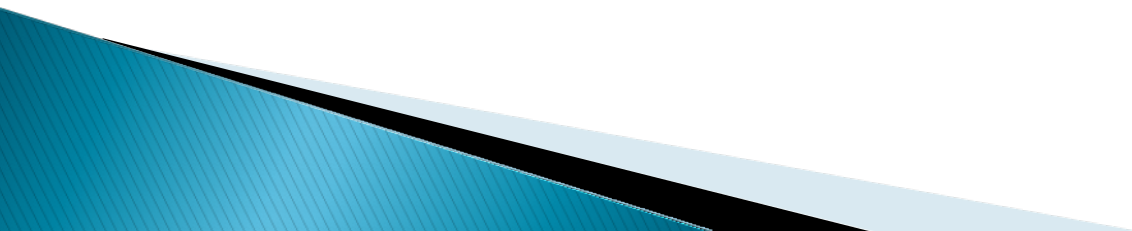
- ▶ **Modify parser** to include operations on semantic attachments as well as syntactic constituents
  - E.g., change an Early-style parser so when constituents are completed, their attached semantic function is applied and a meaning representation created and stored with state
- ▶ Or... let parser run to completion and then **walk through resulting tree**, applying semantic attachments from bottom-up

# Option 1 (Integrated Semantic Analysis)

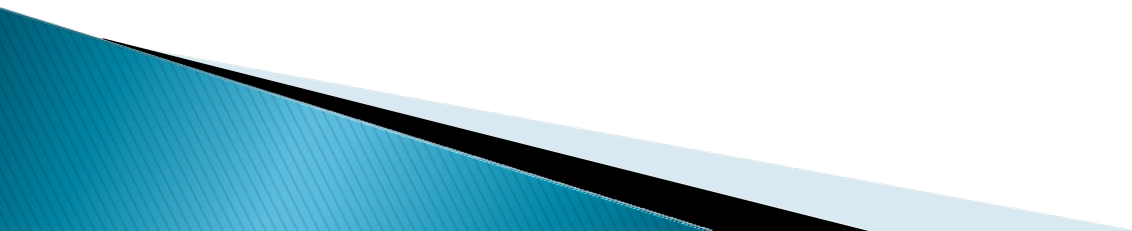
$S \rightarrow NP VP \{VP.sem(NP.sem)\}$

- VP.sem has been stored in state representing VP
  - NP.sem stored with the state for NP
  - When rule completed, retrieve value of VP.sem and of NP.sem, and apply VP.sem to NP.sem
  - Store result in S.sem.
- ▶ As fragments of input parsed, semantic fragments created
- ▶ Can be used to block ambiguous representations

# Example carried through



# What about

- ▶ John slept.
  - ▶ John gave Mary the book.
  - ▶ The door opened
  - ▶ Any others?
- 

# But this is just the tip of the iceberg....

- ▶ Terms can be complex

A restaurant serves burgers.

- 'a restaurant':  $\exists x \text{ Isa}(x, \text{restaurant})$

- $\exists e \text{ Isa}(e, \text{Serving}) \wedge \text{Agent}(e, < \exists x \text{ Isa}(x, \text{restaurant}) >) \wedge \text{Patient}(e, \text{burgers})$

- Allows quantified expressions to appear where terms can be by providing rules to turn them into well-formed FOPC expressions

- ▶ Issues of quantifier scope

Every restaurant serves a burger.

# How to represent other constituents?

## ▶ Adjective phrases:

- Happy people, cheap food, purple socks
- Intersective semantics works for some...

Nom  $\rightarrow$  Adj Nom  $\{\lambda x (\text{Nom.sem}(x) \wedge \text{Isa}(x, \text{Adj.sem}))\}$

Adj  $\rightarrow$  cheap {Cheap}

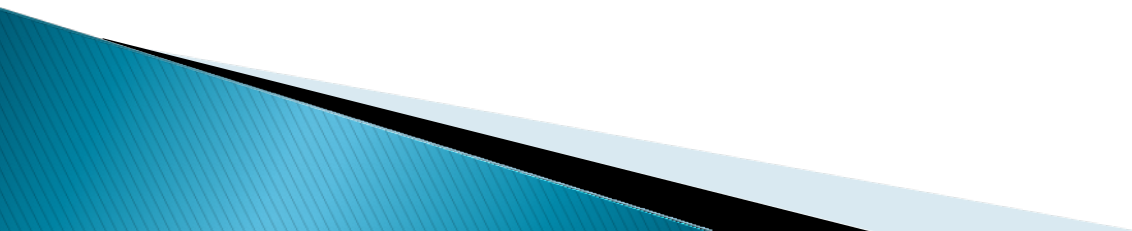
$\lambda x \text{ Isa}(x, \text{Food}) \wedge \text{Isa}(x, \text{Cheap})$

But....fake gun? Local restaurant? Former friend?

Would-be singer?

Ex  $\text{Isa}(x, \text{Gun}) \wedge \text{Isa}(x, \text{Fake})$

# Doing Compositional Semantics

- ▶ To incorporate semantics into grammar we must
    - Determine ‘right’ representation for each basic constituent
    - Determine ‘right’ representation constituents that take these basic constituents as arguments
    - Incorporate semantic attachments into each rule of our CFG
- 



# Drawback

- ▶ You also perform semantic analysis on orphaned constituents that play no role in final parse
- ▶ Case for pipelined approach: Do semantics *after* syntactic parse

# Non-Compositional Language

- ▶ Some meaning *isn't* compositional
  - Non-compositional modifiers: fake, former, local, so-called, putative, apparent,...
  - Metaphor:
    - You're the cream in my coffee. She's the cream in George's coffee.
    - The break-in was just the tip of the iceberg. This was only the tip of Shirley's iceberg.
  - Idiom:
    - The old man finally kicked the bucket. The old man finally kicked the proverbial bucket.
  - Deferred reference: The ham sandwich wants his check.
- ▶ Solution: special rules? Treat idiom as a unit?

# Temporal Representations

- ▶ How do we represent time and temporal relationships between events?

It seems only yesterday that Martha Stewart was in prison but now she has a popular TV show. There is no justice.

- ▶ Where do we get temporal information?
  - Verb tense
  - Temporal expressions
  - Sequence of presentation
- ▶ Linear representations: Reichenbach '47

- **Utterance time (U)**: when the utterance occurs
- **Reference time (R)**: the temporal point-of-view of the utterance
- **Event time (E)**: when events described in the utterance occur

George is eating a sandwich.

-- E,R,U →

George had eaten a sandwich (when he realized...)

E - R - U →

George will eat a sandwich.

--U,R - E →

While George was eating a sandwich, his mother arrived.

# Verbs and Event Types: Aspect

- ▶ **Statives**: states or properties of objects at a particular point in time  
*I am hungry.*
- ▶ **Activities**: events with no clear endpoint  
*I am eating.*
- ▶ **Accomplishments**: events with durations and endpoints that result in some change of state  
*I ate dinner.*
- ▶ **Achievements**: events that change state but have no particular duration – they occur in an instant  
*I got the bill.*

# Beliefs, Desires and Intentions

- ▶ Very hard to represent internal speaker states like believing, knowing, wanting, assuming, imagining
  - Not well modeled by a simple DB lookup approach so..
  - Truth in the world vs. truth in some possible world

George imagined that he could dance.

George believed that he could dance.
- ▶ Augment FOPC with special modal operators that take logical formulae as arguments, e.g. believe, know

Believes(George, dance(George))

Knows(Bill, Believes(George, dance(George)))

▶ **Mutual belief:** I believe you believe I believe....

- Practical importance: modeling belief in dialogue
- Clark's **grounding**

# Summing Up

- ▶ Hypothesis: **Principle of Compositionality**
  - Semantics of NL sentences and phrases can be composed from the semantics of their subparts
- ▶ Rules can be derived which map syntactic analysis to semantic representation (**Rule-to-Rule Hypothesis**)
  - **Lambda notation** provides a way to extend FOPC to this end
  - But coming up with rule to rule mappings is hard
- ▶ **Idioms, metaphors** and other non-compositional aspects of language makes things tricky (e.g. **fake gun**)



# Next

- ▶ Read Ch 19: 1–5