

Semantics for Natural Languages

Informatics 2A: Lecture 25

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 - Syntax and Semantics
 - Compositionality
 - Desiderata for Meaning Representation
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 - Propositional Logic
 - Predicate Logic
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 - Compositionality
 - Lambda Expressions

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Syntax and Semantics

Semantics is concerned with how expressions in a language map to a world – both their

- **denotation** (literal meaning)
- **connotation** (other associations)

When we say (in everyday usage) that a sentence is **ambiguous**, we usually mean it has more than one (literal) meaning.

Some ambiguity comes from words having more than one sense, **some** from sentences having more than one parse tree (syntactic analysis) with respect to a grammar, and **some** from a property called **scope**.

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Syntax and Semantics

A possible 'meaning' for a sentence should take account of both the intended senses of its words and its intended syntactic analysis. Take the example:

I made her duck

- I caused her to drop and avert her head. (*duck* as **action**)
- I created the duck that she owns. (*duck* as **individual**)
- I cooked a/some duck for her. (*duck* as **mass**)

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Syntax and Semantics

Providing a **semantics** for a language (natural or formal) involves giving a **systematic mapping from** the structure underlying a string to its 'meaning'.

While the kinds of meaning conveyed by NL are generally much more complex than those conveyed formal languages, they both adhere to the **principle of compositionality**.

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Desiderata for Meaning Representation

Verifiability: One must be able to use the meaning representation of a sentence to determine whether the sentence is *true* with respect to some given model of the world.

Example: given an exhaustive table of 'who loves whom' relations (a world model), the meaning of a sentence like *everybody loves Mary* can be established by checking it against this model.

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Compositionality

Compositionality: The meaning of a complex expression is a function of the meaning of its parts and of the rules by which they are combined.

While formal languages are designed for **compositionality**, the literal meaning of NL utterances can often be derived compositionally as well.

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Desiderata for Meaning Representation

Unambiguous: a meaning representation should be unambiguous, with one and only one interpretation. If a sentence is ambiguous, there should be a different meaning representation for each sense.

Example: each interpretation of *I made her duck or time flies like an arrow* should have a distinct meaning representation.

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Desiderata for Meaning Representation

Canonical form: the meaning representations for sentences with the same meaning should both be convertible into the same canonical form, that shows their equivalence.

Example: the sentence *I filled the room with balloons* should have the same canonical form with *I put enough balloons in the room to fill it from floor to ceiling*.

Relationships other than identity should be derivable by **entailment** and other forms of **inference**.

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Desiderata for Meaning Representation

Expressivity: a meaning representation should allow a wide range of meanings to be expressed in a natural and revealing way, including **relationships** between the words in a sentence.

Example: we want to express **predicate-argument relations**, i.e., the participants in the event associated with the head of a phrase:

- *Fred eats lentils* (NP V NP): an *eating* event, with Fred doing the eating (*agent*), and lentils being eaten (*theme*);
- *Fred eats lentils with a fork* (NP V NP with NP): the same, but with a fork as the *instrument* used for eating the lentils.

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Desiderata for Meaning Representation

Expressivity: a meaning representation should allow a wide range of meanings to be expressed in a natural and revealing way, including **relationships** between the words in a sentence.

Example: we want to express **restrictions** on the concept denoted by the head of a phrase:

- *brown cow* (**How is *brown* related to *cow*?**)
- *man who came to dinner* (**or *man* related to *came to dinner*?**)
- *walk briskly* (**or *walk* related to *briskly*?**)

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Propositional Logic

Propositional logic is one system for representation and reasoning in which expressions comprise:

- **atomic sentences** (P, Q, etc.);
- **complex sentences** built up from atomic sentences and logical connectives (and, or, not, implies, etc.).

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Predicate Logic

First-order predicate logic (FOPL) is closer to being expressive enough for NL semantics.

Sentences in FOPL are built up from **terms** made from:

- **constant and variable symbols** that represent entities;
- **function symbols** that allow us to indirectly specify entities;
- **predicate symbols** that represent properties of entities and relations that hold between entities;

which are combined into simple sentences (**predicate-argument structures**) and complex sentences through:

| | |
|------------------------------------|-------------------------------|
| quantifiers (\forall, \exists) | disjunction (\vee) |
| negation (\neg) | implication (\Rightarrow) |
| conjunction (\wedge) | equality ($=$) |

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Propositional Logic

Why not use propositional logic as a meaning representation system for NL?

Fred ate lentils or he ate rice. ($P \vee Q$)
Fred ate lentils or John ate lentils ($P \vee R$)

We lose any obvious relationship between the clauses that make up these sentences.

Everyone ate lentils. ($P_1 \wedge P_2 \wedge P_3 \wedge P_4 \dots$)
Someone ate lentils. ($P_1 \vee P_2 \vee P_3 \vee P_4 \dots$)

We can't really express either sentence.

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Constants

Constant symbols:

- **Each constant symbol denotes one and only one entity:**
Scotland, Perth, EU, John, George W. Bush, Scotland, 2007
- **Not all entities have a constant that denotes them:**
George W. Bush's right knee, this pen
- **Several constant symbols may denote the same entity:**
The Morning Star \equiv The Evening Star \equiv Venus
National Insurance number, Student ID, your name

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Predicates

Predicate symbols:

- **Every predicate has a specific arity:** Brown/1, Country/1, Live_in/2, Give/3.
- Each predicate symbol of arity N is interpreted as a set of N -tuples of entities that satisfy it.
- **Predicates of arity 1 denote properties:** Brown/1.
- **Predicates of arity > 1 denote relations:** Live_in/2, Give/3.

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Universal Quantifier (\forall)

Universal quantifiers can be used to express **general truths**:

- *Cats are mammals*
- $\forall x. \text{Cat}(x) \Rightarrow \text{Mammal}(x)$

Universally quantified sentence corresponds to a **conjunction** of sentences in which a constant **substitutes** for a variable.

$$\text{Cat}(\text{sam}) \Rightarrow \text{Mammal}(\text{sam}) \wedge \text{Cat}(\text{zoot}) \Rightarrow \text{Mammal}(\text{zoot}) \\ \wedge \text{Cat}(\text{fritz}) \Rightarrow \text{Mammal}(\text{fritz}) \wedge \dots$$

A quantifier has a **scope**, defined as what depends on it.

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Variables

Variable symbols: x, y, z :

- Variable symbols range over entities.
- An atomic sentence with a variable among its arguments, e.g., Part_of(x , EU), only has a truth value if that variable is **bound** by a quantifier.

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Existential Quantifier (\exists)

Existential quantifier is used to express that a property/relation holds of some entity, without specifying which one:

- *I have a cat*
- $\exists x. \text{Cat}(x) \wedge \text{Own}(i, x)$

An existentially quantified sentence corresponds to **disjunction** of sentences in which a constant **substitutes** for a variable.

$$(\text{Cat}(\text{Josephine}) \wedge \text{Own}(I, \text{Josephine})) \vee \\ (\text{Cat}(\text{Zoot}) \wedge \text{Own}(I, \text{Zoot})) \vee \\ (\text{Cat}(\text{Malcolm}) \wedge \text{Own}(I, \text{Malcolm})) \vee \\ (\text{Cat}(\text{John}) \wedge \text{Own}(I, \text{John})) \vee \dots$$

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Existential Quantifier (\exists)

Why do we use “ \wedge ” rather than “ \Rightarrow ” with the existential quantifier? What would the following correspond to?

$$\exists x. \text{Cat}(x) \Rightarrow \text{Own}(i, x)$$

- (a) I own a cat
- (b) There is something that if it's a cat, I own it

What if that something is not a cat?

- The proposition formed by connecting two propositions with \Rightarrow is true if the antecedent (the left of the \Rightarrow) is false.
- So this proposition is true if there is something that's a laptop, for example: “I own a cat” shouldn't be true simply for this reason.

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Clicker Questions

Which one of the sentences below does *not* correspond to the formula $\forall x. \text{cow}(x) \Rightarrow \text{domesticated}(x) \wedge \text{bovine}(x)$?

- 1 Every cow is a domesticated bovine
- 2 A cow is a domesticated bovine
- 3 Every domesticated bovine is a cow
- 4 A cow is domesticated and a bovine

Which of the following expressions corresponds to the sentence *Every dog has a bone*?

- 1 $\forall x \exists y \text{ dog}(x) \Rightarrow \text{bone}(y)$?
- 2 $\exists y \text{ dog}(y) \Rightarrow \text{bone}(y)$?
- 3 $\forall x \exists y \text{ dog}(y) \Rightarrow \text{bone}(x)$?
- 4 $\forall x \exists y \text{ dog}(x) \wedge (y)$?

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Clicker Questions

Which one of the sentences below does *not* correspond to the formula $\forall x. \text{cow}(x) \Rightarrow \text{domesticated}(x) \wedge \text{bovine}(x)$?

- 1 Every cow is a domesticated bovine
- 2 A cow is a domesticated bovine
- 3 Every domesticated bovine is a cow
- 4 A cow is domesticated and a bovine

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Clicker Questions

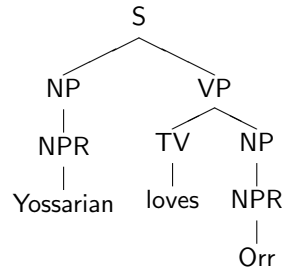
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Compositionality

Compositionality: The meaning of a complex expression is a function of the meaning of its parts and of the rules by which they are combined.

Do we have sufficient tools to **systematically compute** meaning representations according to this principle?



- If **loves** is the binary predicate $\text{love}(x,y)$ and **Orr** is **orr**, how do we combine them to produce an interpretation **loves Orr**?
- To compute NL interpretations compositionally, we need **lambda expressions (λ -expressions)**.

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Lambda expressions can be **nested**. We can use nesting to create functions of several arguments that accept their arguments one at a time.

$\lambda y. \lambda x. \text{love}(x,y)$ 'The function that takes y to (the function that takes x to the statement $\text{love}(x,y)$)'

$\lambda z. \lambda y. \lambda x. \text{give}(x,y,z)$ 'The function that takes z to (the function that takes y to (the function that takes x to the statement $\text{give}(x,y,z)$)')'

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Lambda (λ) Expressions

λ -**expressions** are an extension to FOPL that allows us to work with '**partially constructed**' formulae. A λ -expression consists of:

- the Greek letter λ , followed by a variable (**formal parameter**);
- a FOPL expression that may involve that variable.

$\lambda x. \text{sleep}(x)$

'The function that takes an entity x to the statement $\text{sleep}(x)$ '

$\underbrace{(\lambda x. \text{sleep}(x))}_{\text{functor}} \underbrace{(\text{orr})}_{\text{argument}}$

A λ -expression can be **applied** to a **term** has the same truth value as $\text{sleep}(\text{orr})$

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Beta Reduction

When a lambda expression **applies** to a term, a reduction operation (**beta (β) reduction**) can be used to replace its formal parameter with the term and simplify the result.

$\underbrace{(\lambda x. \text{sleep}(x))}_{\text{functor}} \underbrace{(\text{orr})}_{\text{argument}}$ simplifies to $\Rightarrow_{\beta} \text{sleep}(\text{orr})$

$\underbrace{(\lambda y. \lambda x. \text{love}(x,y))}_{\text{functor}} \underbrace{(\text{crabapples})}_{\text{argument}} \Rightarrow_{\beta} \lambda x. \text{love}(x, \text{crabapples})$
 $\underbrace{(\lambda x. \text{love}(x, \text{crabapples}))}_{\text{functor}} \underbrace{(\text{orr})}_{\text{argument}} \Rightarrow_{\beta} \text{love}(\text{orr}, \text{crabapples})$

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Summary

- Principle of compositionality: the meaning of an complex expression is a function of the meaning of its parts;
- predicate logic can be used as a meaning representation language for natural language;
- λ -expressions can be used to compute meaning representations from syntactic trees based on the principle of compositionality;
- in the next lecture, we will see how a probabilistic model can be learned that automates this mapping.