

The Representation of Meaning

Sections 17.1 - 17.2 in Textbook

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T-725-MALV

Performing Language Tasks

- **Language** is central to many **tasks**
 - Answering a question
 - Interrogating a suspect
 - Summarizing a story
 - Learning from written instructions
 - Understanding a joke
- But those tasks cannot be properly performed without a **link from linguistic elements to non-linguistic world knowledge**

Meaning Representations

- ...are formal structures that can capture the **meaning of linguistic expressions**
- Created through **semantic analysis** of linguistic input
- Facilitate further **semantic processing**
- Their syntax and semantics specified by **meaning representation languages**

Sample Representations

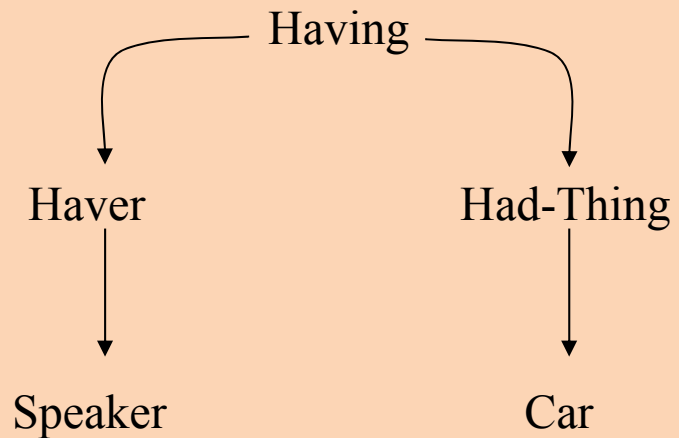
Linguistic input: "I have a car"

Meaning representation (4 examples):

$\exists e,y \text{Having}(e) \wedge \text{Haver}(e,S) \wedge \text{HadThing}(e,y) \wedge \text{Car}(y)$

Car
↑↑ POSS-BY
Speaker

Having
Haver: Speaker
HadThing: Car



Meaning Representations

- All consists of **structures** composed from a **set of symbols** (vocabulary)
 - When symbols are **properly arranged**, the structures **correspond to**
 - objects
 - properties of objects
 - relations among objects
- in some **state of affairs being represented**

Two Perspectives

- Meaning Representations can be viewed as:
 - (1) Representation of the **meaning of the linguistic input**
 - (2) Representation of the **state of affairs** in some world
- This allows us to **link linguistic input to world!**

Literal Meaning

- For now we are only concerned with the literal meaning of sentences
 - **not** highly **contextual** or implied meaning, including idioms and metaphors

Representation Requirements

- To be useful, our meaning representation needs to **fulfil certain requirements**:
 - Be verifiable
 - Be unambiguous
 - Provide canonical form
 - Support inference
 - Support variables
 - Be expressive (enough)

Verifiability

- Can the meaning representation of a linguistic expression be **compared to a representation of state of affairs** in some world as modeled in a knowledge base?
- We need to be able to determine the truth of our representations

Does Maharani serve vegetarian food?

Serves(Maharani, Vegetarian) (Input Representation)

MATCHES

Serves(Maharani, Vegetarian) (Knowledge Representation)

Unambiguous

- **Linguistic** expressions can have **different meaning** representations assigned to them:

I wanna eat someplace that's close to ICSI

- **Final representation** of an input's meaning should be **free from any ambiguity**

- **Vagueness** however can be useful, and therefore **ok**

I want to eat Italian food

Canonical Form

- There may be multiple ways to express something, but this should result in **one common meaning representation**

1. Maharani has vegetarian dishes

2. They have vegetarian food at Maharani

Serves(Maharani, Vegetarian)

Inference

- Need to be able to **draw conclusions** about the truth of linguistic expressions that are not explicitly represented in the world state representation (knowledge base) but are **logically derivable** from it

Maharani serves vegetarian food (in knowledge base)

Vegetarians eat vegetarian food (in knowledge base)

Can vegetarians eat at Maharani? (verifiable?)

Variables

- We may get references to **unknown** and unnamed entities

I'd like to find a restaurant serving vegetarian

Serves(x , Vegetarian)

Matching succeeds if **substitution** maintains truth of full proposition

Expressiveness

- Expressive enough to handle an extremely **wide range** of natural language expressions and subject matter

Model-Theoretic Semantics

- **Model** is a formal construct that stands for the **particular state** of affairs in the world that we are trying to represent
- We can **map expressions** in a meaning representation language **to elements** of the model
- Thus representations can do the work we require of them

Model-Theoretic Semantics

- Vocabulary of a meaning representation consists of
 - **non-logical vocabulary**: Open-ended set of names for the objects, properties and relations
 - **logical vocabulary**: Closed-set of symbols, operators, quantifiers, etc.

Model-Theoretic Semantics

- Each element of the non-logical vocabulary (objects, properties and relations) has a **denotation** (a fixed, well-defined part) in the model

Model-Theoretic Semantics

- The **domain of a model** is the set of **objects** that are part of the world being represented
 - **Objects** denote elements of the domain
 - **Properties** denote sets of elements of the domain
 - **Relations** denote sets of tuples of elements of the domain

Model Example

Domain

Matthew, Franco, Katie and Caroline
Frasca, Med, Rio
Italian, Mexican, Eclectic

$$D = \{a,b,c,d,e,f,g,h,i,j\}$$

a,b,c,d

e,f,g

h,i,j

Properties

Noisy

Frasca, Med, and Rio are noisy

$$\text{Noisy} = \{e,f,g\}$$

Relations

Likes

Matthew likes the Med
Katie likes the Med and Rio
Franco likes Frasca
Caroline likes the Med and Rio

$$\text{Likes} = \{\langle a,f \rangle, \langle c,f \rangle, \langle c,g \rangle, \langle b,e \rangle, \langle d,f \rangle, \langle d,g \rangle\}$$

$$\text{Serves} = \{\langle e,j \rangle, \langle f,i \rangle, \langle e,h \rangle\}$$

Serves

Med serves eclectic
Rio serves Mexican
Frasca serves Italian

Matthew likes Med

TRUE

a Likes f

$\langle a,f \rangle$ found in Likes

Model-Theoretic Semantics

- Verifying the truth value of simple expressions like "Matthew likes Med" is straight-forward
- However, expressions can be **more complex**
 1. *Katie likes the Rio and Matthew likes the Med*
 2. *Katie and Caroline like the same restaurants*
 3. *Not every body likes Frasca*
- Need method for determining truth of complex expressions from **meaning of parts** and **meaning of logical operators**, e.g. conjunction

First-Order Logic

Section 17.3 in Textbook

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First-Order Logic

- **FOL** is a **Meaning Representation Language** that provides sound computational basis for
 - verifiability
 - inference
 - expressivenessand a sound model-theoretic semantics
- The represented world consists of
 - objects, properties of objects and relations among objects

FOL Context-free Grammar

Formula \rightarrow AtomicFormula

| Formula Connective Formula

| Quantifier Variable, ... Formula

| \neg Formula

| (Formula)

Connective $\rightarrow \wedge \mid \vee \mid \Rightarrow$

Quantifier $\rightarrow \forall \mid \exists$

Constant $\rightarrow A \mid \text{Vegetarian} \mid \text{Maharani} \dots$

AtomicFormula \rightarrow Predicate(Term, ...)

Variable $\rightarrow x \mid y \mid \dots$

Term \rightarrow Function(Term, ...)

| Constant

| Variable

Predicate \rightarrow Serves | Near | ...

Function \rightarrow LocationOf | CuisineOf | ...

Basic Elements: Objects

Formula \rightarrow AtomicFormula

| Formula Connective Formula

| Quantifier Variable, ... Formula

| \neg Formula

| (Formula)

Connective $\rightarrow \wedge | \vee | \Rightarrow$

Quantifier $\rightarrow \forall | \exists$

Constant \rightarrow A | Vegetarian | Maharani ...

AtomicFormula \rightarrow Predicate(Term, ...)

Variable \rightarrow x | y | ...

Term \rightarrow Function(Term, ...)

| Constant

| Variable

Predicate \rightarrow Serves | Near | ...

Function \rightarrow LocationOf | CuisineOf | ...

Constants: Harry, Susan, Sun **Functions:** HeightOf, AgeOf

Variables: w, x

Basic Elements: Relations

Formula \rightarrow AtomicFormula

| Formula Connective Formula

| Quantifier Variable, ... Formula

| \neg Formula

| (Formula)

Connective $\rightarrow \wedge | \vee | \Rightarrow$

Quantifier $\rightarrow \forall | \exists$

Constant $\rightarrow A | \text{Vegetarian} | \text{Maharani} \dots$

AtomicFormula \rightarrow **Predicate**(Term, ...)

Variable $\rightarrow x | y | \dots$

Term \rightarrow Function(Term, ...)

| Constant

| Variable

Predicate \rightarrow Serves | Near | ...

Function \rightarrow LocationOf | CuisineOf | ...

Predicates: Likes(Harry, Susan), Enjoys(Susan, Sun)

Basic Elements: Properties

Formula \rightarrow AtomicFormula

| Formula Connective Formula

| Quantifier Variable, ... Formula

| \neg Formula

| (Formula)

Connective $\rightarrow \wedge | \vee | \Rightarrow$

Quantifier $\rightarrow \forall | \exists$

Constant $\rightarrow A | \text{Vegetarian} | \text{Maharani} \dots$

AtomicFormula \rightarrow **Predicate**(Term, ...)

Variable $\rightarrow x | y | \dots$

Term \rightarrow Function(Term, ...)

| Constant

| Variable

Predicate \rightarrow Serves | Near | ...

Function \rightarrow LocationOf | CuisineOf | ...

Predicates: Likes(Harry, Susan), Enjoys(Susan, Sun)
Person(Harry), Smiling(Susan), Shining(Sun)

Complex Representations

Formula → AtomicFormula

| Formula Connective Formula

| Quantifier Variable, ... Formula

| \neg Formula

| (Formula)

Connective → \wedge | \vee | \Rightarrow

Quantifier → \forall | \exists

Constant → A | Vegetarian | Maharani ...

AtomicFormula → Predicate(Term, ...)

Variable → x | y | ...

Term → Function(Term, ...)

| Constant

| Variable

Predicate → Serves | Near | ...

Function → LocationOf | CuisineOf | ...

More complex: Likes(Harry, Susan) \wedge Smiling(Susan) \wedge \neg Shining(Sun)

Variables and Quantifiers

Formula \rightarrow AtomicFormula

| Formula Connective Formula

| Quantifier Variable, ... Formula

| \neg Formula

| (Formula)

Connective $\rightarrow \wedge | \vee | \Rightarrow$

Quantifier $\rightarrow \forall | \exists$

Constant \rightarrow A | Vegetarian | Maharani ...

AtomicFormula \rightarrow Predicate(Term, ...)

Variable \rightarrow x | y | ...

Term \rightarrow Function(Term, ...)

| Constant

| Variable

Predicate \rightarrow Serves | Near | ...

Function \rightarrow LocationOf | CuisineOf | ...

There exists: $\exists x \text{ Person}(x) \wedge \text{Smiling}(x)$ (use conjunction)

For all: $\forall y \text{ Person}(y) \Rightarrow \text{Likes}(y, \text{Susan})$ (use implication)

Semantics of FOL

- The **objects** (terms) denote elements in a model **domain**
- **Atomic formulas** are sets of domain elements (properties) or sets of tuples (relations)
- Verifying these as simple as checking **membership in sets**
- What about verifying more **complex formulas?**

Semantics of Connectives

- Formulas containing connectives are interpreted based on **meaning of components** combined with **meaning of connectives** themselves
 - Semantics of connectives given in **truth table**

P	Q	$\neg P$	$P \wedge Q$	$P \vee Q$	$P \Rightarrow Q$
False	False	True	False	False	True
False	True	True	False	True	True
True	False	False	False	True	False
True	True	False	True	True	True

Inference

- **Modus ponens** most widely implemented inference method provided by FOL

1 α

2 $\alpha \Rightarrow \beta$

3 β

(if left hand side is true...)

(...we can infer the right hand side)