

# **CSC 481: Expressing Knowledge**

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# Goal

Review the knowledge engineering process by going over the First-Order Logic statements that make up the “Soap Opera” world

- At the end of this class, you should be able to represent simple english sentences in FOL

# Vocabulary

## Types of objects

### **Types of objects** (Named individuals, or constants)

- People
- Animals
- Corporations
- Locations
- Physical objects (knives, earrings...)

# Vocabulary

## Properties

**Properties** (1-ary predicates)

“Types”	“Attributes”
<ul style="list-style-type: none"><li>● Person</li><li>● Man</li><li>● Place</li><li>● Company</li></ul>	<ul style="list-style-type: none"><li>● Beautiful</li><li>● HappilyMarried</li><li>● ClosedFor Repairs</li><li>● Bloody</li></ul>

What’s the conceptual difference between “Types” and “Attributes”?

# Vocabulary

## Relationships

### **Relationships** (n-ary predicates)

- MarriedTo
- DaughterOf
- LivesAt
- HasCEO
- HadAnAffairWith|
- LoveTriangle (3-ary)
- OccursInTimeInterval (3-ary: event, start time, end time)

# Basic Facts

## Basic Facts

- Man(john)
- Rich(john)
- Company(faultyInsuranceCompany)
- $\neg$ HappilyMarried(jim)
- bestFriendOf(jim)=john
- fic=faultyInsuranceCompany
- ceoOf(fic) = john
- Married(Alice, Bob)

# Complex Facts

## Complex Facts

- $\forall y[Rich(y) \wedge Man(y) \rightarrow Loves(y, jane)]$
- $\forall y[Woman(y) \wedge y \neq jane \rightarrow Loves(y, john)]$
- $\forall x, y[Loves(x, y) \rightarrow \neg Blackmails(x, y)]$
- $Loves(jane, john) \vee Loves(jane, jim)$
- $\exists x[Adult(x) \wedge Blackmails(x, john)]$
- $\forall x[Lawyer(x) \rightarrow x = jane \vee x = jack \vee x = jim \vee \dots]$
- $jane \neq john \quad jane \neq john$

How would you write “every CEO is rich”?

# Terminological Facts

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- $\forall x[Man(x) \rightarrow \neg Woman(x)]$  (disjointness)
- $\forall x[Surgeon(x) \rightarrow Doctor(x)]$  (subtypes)
- $\forall x[Adult(x) \rightarrow Man(x) \vee Woman(x)]$  (exhaustiveness)
- $\forall x[MarriedTo(x, y) \rightarrow MarriedTo(y, x)]$  (symmetry)<sup>1</sup>
- $\forall x[ChildOf(x, y) \rightarrow ParentOf(y, x)]$  (inverses)
- $\forall x, y[MarriedTo(x, y) \rightarrow Person(x) \wedge Person(y)]$  (type restriction)
- $\forall x[RichMan(x) \equiv Rich(x) \wedge Man(x)]$  (full definition)

How would you write a sentence indicating that a predicate (e.g. TallerThan) is transitive?



# Order of quantifiers

- Careful when mixing existential and universal quantifiers!
  - $\forall x \exists y : \text{loves}(x, y)$  “everybody loves someone” (possibly themselves)
  - $\exists y \forall x : \text{loves}(x, y)$  “someone is loved by everyone” (including themselves)
  - $\forall x \exists y : \text{loves}(x, y) \wedge x \neq y$  “everybody loves someone **else**”
  - $\exists y \forall x : x \neq y \rightarrow \text{loves}(x, y)$  “someone is loved by everyone (possibly excluding themselves)”
- If you’re using only one type of quantifier, order doesn’t matter

“Is there a company whose CEO loves Jane?”

$$KB \models \exists x[Company(x) \wedge Loves(ceoOf(x), jane)]?$$

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Yes

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“If no man is blackmailing John, is he being blackmailed by someone he loves?”

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# Entailments

“If no man is blackmailing John, is he being blackmailed by someone he loves?”

$$KB \models \forall x[Man(x) \rightarrow \neg Blackmails(x, john)] \rightarrow \\ \exists y[Loves(john, y) \wedge Blackmails(y, john)]?$$

Yes!

What if we don't assume that no man is blackmailing John?

Then no!

# Reification

Turning a predicate or statement into an addressable object

- Expressing statements at an arbitrary level of granularity
- Handling incompatible statements,
- Handling intentions, beliefs, etc held by different actors
- Representing values that can be expressed in many different units

# Shortcomings of FOL

It is hard to represent:

- Statistical and probabilistic facts (“Jane is 50% likely to go to the party”)
- “Fuzzy” degrees of truth (“John is somewhat tall”, “Bob is very tall”)
- Default and prototypical facts (“Most CEOs are rich”)
- Temporal events
- Intentional facts (Beliefs, desires, beliefs about beliefs, etc.)
  - Some of these are somewhat addressable with reification

# Next chapter - Resolution

- So far, we have done inference “by hand”
- Reasoning with FOL is usually done by asking questions of the form:

$$KB \models \alpha?$$

- This is the equivalent of asking if  $\alpha$  is satisfied in every interpretation where KB is satisfied.
- We want to mechanize the process of answering this question with the rule of Resolution