



COMP4418: Knowledge Representation and Reasoning

Expressing Knowledge

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Knowledge engineering

KR is first and foremost about knowledge

- meaning and entailment
- find individuals and properties, then encode facts sufficient for entailments

Before implementing, need to understand clearly

- what is to be computed?
- why and where inference is necessary?

Example domain: university world

- people, lecturers, students, courses, graduations, awards, . . .

Task: KB with appropriate entailments

- what vocabulary?
- what facts to represent?

Vocabulary

Domain-dependent predicates and functions

- main question: what are the individuals?
- here: people, academics, students, courses, ...

named individuals

- alice, comp4418, facultyOfEngineering, foe, , ...

basic types

- Person, Academic, Student, Course, ...

attributes

- year1, year2, ..., core, elective, ...

relationships

- EnrolledIn, LecturerOf, ...

functions

- lecturerOf, licOf, bestFriendOf, ...

Basic facts

Usually atomic sentences and negations

- type facts
Student(alice),
Lecturer(barbara),
Course(comp4418)
- property facts
Difficult(comp4418),
 \neg Studious(allan),
Studies(alice,comp4418)
- equality facts
barbara = lecturerInCharge(comp1234),
krr = comp4418,
bestFriendOf(allan) = alice

Like a simple database

could store these facts in relational tables

Complex facts

Universal abbreviations

$\forall x. \text{LecturerInCharge}(x, x)$

$\forall x, y, z. (\text{Lectures}(x, y) \wedge \text{Studies}(z, y)) \rightarrow \text{Teaches}(x, z)$

possible to express without quantifiers

Incomplete knowledge

$\text{Studies}(\text{alice}, \text{comp4418}) \vee \text{Studies}(\text{allan}, \text{comp4418})$

which?

stronger

$\forall x. \text{Studies}(x, \text{comp9444}) \vee \text{Studies}(x, \text{comp9517})$

$\exists x[\text{Student}(x) \wedge \text{Studies}(x, \text{comp4418})]$

who?

cannot write down more complete version

Closure axioms

$\forall x[\text{Student}(x) \rightarrow x = \text{alice} \vee x = \text{allan} \vee x = \text{brad} \dots]$

$\forall x \forall y[\text{Studies}(x, y) \rightarrow \dots]$

$\forall x[x = \text{comp4418} \vee x = \text{alice} \vee x = \text{allan} \vee x = \text{barbara} \dots]$

limits domain of discourse

also useful to have $\text{alice} \neq \text{allan} \dots$

Terminological facts

General relationships among predicates. For example:

- disjoint

$$\forall x[\text{Mammal}(x) \rightarrow \neg \text{Reptile}(x)]$$

- subtype

$$\forall x[\text{Mammal}(x) \rightarrow \text{Animal}(x)]$$

- exhaustive

$$\forall x[\text{Day}(x) \rightarrow \text{Monday}(x) \vee \dots \vee \text{Sunday}(x)]$$

- symmetry

$$\forall x \forall y[\text{RelatedTo}(x,y) \rightarrow \text{RelatedTo}(y,x)]$$

- inverse

$$\forall x \forall y[\text{StudentOf}(x,y) \rightarrow \text{LecturerOf}(y,x)]$$

- type restriction

$$\forall x \forall y[\text{Studies}(x,y) \rightarrow \text{Student}(x) \wedge \text{Course}(y)]$$

- full definition

$$\forall x[\text{comp4418Student}(x) \equiv \text{Student}(x) \wedge \text{Studies}(x, \text{comp4418})]$$

$$\forall x[\text{aiMajor}(x) \equiv \text{Student}(x) \wedge [(\text{Studies}(x, \text{comp4418}) \wedge \text{Studies}(x, \text{comp9444})) \vee (\text{Studies}(x, \text{comp4418}) \wedge \text{Studies}(x, \text{comp9517})) \vee (\text{Studies}(x, \text{comp9444}) \wedge \text{Studies}(x, \text{comp9517}))]]]$$

- Usually universally quantified conditionals or biconditionals

Entailments: 1

Is there a course whose Lecturer-in-Charge teaches Alice?

$\exists x[\text{Course}(x) \wedge \text{Teaches}(\text{lic}(x), \text{alice})]$??

Suppose $I \models KB$.

Then $I \models \text{Course}(\text{comp4418})$

Also $I \models \forall x. \text{Lectures}(\text{lecturerInCharge}(x), x)$

so $I \models \text{Lectures}(\text{lecturerInCharge}(\text{comp4418}), \text{comp4418})$.

Finally $I \models \forall x, y, z. (\text{Lectures}(x, y) \wedge \text{Studies}(z, y)) \rightarrow \text{Teaches}(x, z)$

and $I \models \text{Studies}(\text{alice}, \text{comp4418})$

so $I \models \text{Teaches}(\text{lecturerInCharge}(\text{comp4418}), \text{alice})$.

Thus, $I \models \text{Course}(\text{comp4418}) \wedge \text{Teaches}(\text{lecturerInCharge}(\text{comp4418}), \text{alice})$,

and so

$I \models \exists x[\text{Course}(x) \wedge \text{Teaches}(\text{lecturerInCharge}(x), \text{alice})]$.

Can extract identity of Lecturer-in-Charge (since $I \models \text{barbara} = \text{lecturerInCharge}(\text{comp4418})$)

Entailments: 2

If nobody is studying comp9444, then is there a someone studying comp9517 who is an AI major?

$\forall x[\text{Student}(x) \rightarrow \neg \text{Studies}(x, \text{comp9444})] \rightarrow \exists y[\text{Student}(y) \wedge \text{Studies}(y, \text{comp9517})] ??$

Note: $KB \models (\alpha \rightarrow \beta)$ iff $KB \cup \{\alpha\} \models \beta$ (Deduction Theorem)

Assume: $I \models KB \cup \{\forall x[\text{Student}(x) \rightarrow \neg \text{Studies}(x, \text{comp9444})]\}$

Show: $I \models \exists y[\text{Student}(y) \wedge \text{Studies}(y, \text{comp9517}) \wedge \text{aiMajor}(y)]$

Have: Student(alice)

and $\forall x[\text{Student}(x) \rightarrow \neg \text{Studies}(x, \text{comp9444})]$

so $\neg \text{Studies}(\text{alice}, \text{comp9444})$

Also: $\forall x. \text{Studies}(x, \text{comp9444}) \vee \text{Studies}(x, \text{comp9517})$

so $\text{Studies}(\text{alice}, \text{comp9517})$

Also: $\text{Studies}(\text{alice}, \text{comp4418})$

Finally: $\forall x[\text{aiMajor}(x) \equiv \text{Student}(x) \wedge [(\text{Studies}(x, \text{comp4418}) \wedge \text{Studies}(x, \text{comp9444})) \vee$
 $(\text{Studies}(x, \text{comp4418}) \wedge \text{Studies}(x, \text{comp9517})) \vee$
 $(\text{Studies}(x, \text{comp9444}) \wedge \text{Studies}(x, \text{comp9517}))]]]$

so $\text{aiMajor}(\text{alice})$

Hence: $\exists y[\text{Student}(y) \wedge \text{Studies}(y, \text{comp9517}) \wedge \text{aiMajor}(y)]$

Proof as sequence of sentences

What individuals?

Sometimes useful to reduce n-ary predicates to 1-place predicates and 1-place functions

- involves reifying properties: new individuals
- typical of description logics / frame languages (later)

Flexibility in terms of arity:

Purchases(john,sears,bike) or
Purchases(john,sears,bike,feb14) or
Purchases(john,sears,bike,feb14,\$100)

Instead introduce purchase objects

$\text{Purchase}(p) \wedge \text{agent}(p)=\text{john} \wedge \text{obj}(p)=\text{bike} \wedge \text{source}(p)=\text{sears} \wedge \text{amount}(p)=\dots \wedge \dots$

allows purchase to be described at various levels of detail

Complex relationships:

MarriedTo(x,y) vs.
PreviouslyMarriedTo(x,y) vs.
ReMarriedTo(x,y)

Define marital status in terms of existence of marriages and divorces.

$\text{Marriage}(m) \wedge \text{partner1}(m)=x \wedge \text{partner2}(m)=y \wedge \text{date}(m)=\dots \wedge \text{witness}(m)=\dots \wedge \dots$

Abstract individuals

Also need individuals for numbers, dates, times, addresses, etc.

- objects about which we ask wh-questions

Quantities as individuals

$$\text{age}(\text{suzy}) = 14$$

$$\text{age-in-years}(\text{suzy}) = 14$$

$$\text{age-in-months}(\text{suzy}) = 168$$

perhaps better to have an object for the age of Suzy, whose value in years is 14

$$\text{years}(\text{age}(\text{suzy})) = 14$$

$$\text{months}(x) = 12 * \text{years}(x)$$

$$\text{centimeters}(x) = 100 * \text{meters}(x)$$

Similarly with locations and times

instead of

$$\text{time}(m) = \text{“Jan 5 1992 4:47:03EST”}$$

can use

$$\text{time}(m) = t \wedge \text{year}(t) = 1992 \wedge \dots$$

Other sorts of facts

Statistical / probabilistic facts

- Half of the companies are located on the East Side
- Most of the employees are restless
- Almost none of the employees are completely trustworthy

Default / prototypical facts

- Company presidents typically have secretaries intercepting their phone calls
- Cars have four wheels

Intentional facts

- John believes that Henry is trying to blackmail him
- Jane does not want Jim to think that she loves John

Others ...