

# **CS208 (Semester 1) Topic 8 : Semantics of Predicate Logic**

Dr. Robert Atkey

Computer & Information Sciences



# Semantics of Predicate Logic, Part 1 Models



# So far: Syntax and Proof

- 1. Topic 3: The syntax of predicate logic What sequences of symbols are well formed?
- **2.** Topic 4: Proofs for predicate logic When are formulas consequences of other formulas?
- **3.** Topics 5-7: Hoare Logic An Application of Predicate Logic



## Missing so far: semantics

- **1.** For Propositional Logic, we defined the *semantics* ("meaning") of a formula P:
  - For every valuation v, the formula P is assigned a meaning [P] v which is either T or F.
- **2.** This definition enabled us to give a definition of *entailment*:

$$P_1, \ldots, P_n \models Q$$

which defines consequence without using proofs.



## **Semantics for Predicate Logic**

### The plan:

- **1.** Fix vocabularies  $\mathcal{V}$
- **2.** Define *models*  $\mathcal{M}$  for  $\mathcal{V}$
- 3. Interpret *formulas* P using vocabulary  $\mathcal V$  in models  $\mathcal M$
- **4.** Find uses for models (databases, generation, ...)
- **5.** ...
- 6. Profit!



# Fixing a Vocabulary

The function symbols we will use, and their *arities* (number of arguments):

Function name(s)	Arity
socrates	0
dayAfter	1
+,-	2

We write "func/n" for function symbol func with arity n



# Fixing a Vocabulary

The predicates / relation symbols we will use, and their arities:

Predicate name(s)	Arity
human, mortal	1
$<, \leq, =$	2
between	3

We write "pred/n" for predicate symbol pred with arity n



### A simplification

To keep things simple, I'm going to assume that we don't have any function symbols in our vocabulary.

## **Example: Orderings**

 $\geq$   $\leq$  /2 "less than"



## **Example: Places**

- ► city/1 "is a city"
- ▶ within/2 "is within"
- ► country/1 "is a country"

## **Example: Forestry and Birdwatching**

- ► tree/1 "is a tree"
- ► green/1 "is green"
- ▶ bird/1 "is a bird"
- ► satIn/2 "has sat in"

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## Models

With a fixed vocabulary, a model  $\mathcal{M}$  is:

1. A universe U, which is a set of individuals:

 $U = \{1, 2, \mathsf{socrates}, \mathsf{hypatia}, \mathsf{noether}, \mathsf{alexandria}, \mathsf{glasgow}, \dots\}$ 

**2.** For each predicate pred/n, an n-ary relation on the set U.



## Relations

Several ways of understanding what a relation is:

- 1. For every n elements from U, the interpretation of pred/n assigns the value T or F.
- 2. The interpretation of pred/n is a (possibly infinite) table of elements of U with n columns.
- 3. The interpretation of pred/n is a subset of the n-fold *cartesian* product  $\underbrace{U \times \cdots \times U}$ .



```
11
        = {aberdeen, edinburgh, glasgow, scotland, birmingham, england
city = {aberdeen, edinburgh, glasgow, birmingham}
country = \{england, scotland\}
within = \{(aberdeen, scotland), (edinburgh, scotland), \}
           (glasgow, scotland), (birmingham, england)}
```

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 $U = \{aberdeen, edinburgh, glasgow, scotland, birmingham, england\}$ 

#### As tables:

city
aberdeen
edinburgh
glasgow
birmingham

country
england
scotland

within	
aberdeen	scotland
edinburgh	scotland
glasgow	scotland
birmingham	england



```
 \begin{array}{lll} U & = \{loopland\} \\ \text{city} & = \{loopland\} \\ \text{country} & = \{loopland\} \\ \text{within} & = \{(loopland, loopland)\} \\ \end{array}
```



```
U = {loopland}
city = {loopland}
country = {loopland}
within = {(loopland, loopland)}
```

The names are only there to separate the predicates. Models do not have to match our intuition for the names.



### **Example:** Interpreting ordering with natural numbers

- 1.  $U = \{0, 1, 2, ...\} = \mathbb{N}$  (all positive whole numbers)
- 2. The interpretation of  $\leq /2$  is all pairs (x, y) such that  $x \leq y$

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### **Example: Interpreting ordering with rational numbers**

- 1.  $U = \{0, -1, 1, -\frac{1}{2}, \frac{1}{2}, -2, 2, \dots\} = \mathbb{Q}$
- 2. The interpretation of  $\leq /2$  is all pairs (x, y) such that  $x \leq y$

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## Example: Interpreting ordering with a small set

- 1.  $U = \{a, b, c\}$
- **2.** The interpretation of  $\leq /2$  is the set:

$$\{(a,b),(a,c)\}$$

Note! not necessarily what we might think of as  $\leq$ ! Need to add axioms.



## **Important Points**

Every model  $\mathcal M$  has

- 1. a universe; and
- **2.** a relation for each predicate symbol pred/n, but the domain can be empty, or the predicate symbols' interpretations may be empty!

The model needn't match our intuition about the symbols!

▶ Will assume formulas that will restrict the possible models.



# Relationship to Valuations

If all our predicate symbols have arity 0 (take no arguments), then a model consists of:

- 1. A universe U; and
- **2.** An assignment of T or F to each predicate symbol pred/0.

Apart from the universe, this is the same as a *valuation* in Propositional Logic (Topic 0).



## **Summary**

We interpret Predicate Logic formulas in a model  $\mathcal{M}$ .

- ► A universe U the set of all "things".
- ► A relation between elements of U for every predicate.

Useful intuition: models are (possibly infinite) databases.



# Semantics of Predicate Logic, Part 2

# Interpreting Formulas



# Meaning of free variables

Assume a vocabulary V and model M are fixed.

Consider the formula:

$$city(x) \wedge within(x, y)$$

we can't give it a truth value until we know what x and y mean.



## **Cities Model**

 $U = \{aberdeen, edinburgh, glasgow, scotland, birmingham, england\}$ 

#### As tables:

city	
aberdeen	
edinburgh	
glasgow	
birmingham	

country
england
scotland

within		
aberdeen	scotland	
edinburgh	${\sf scotland}$	
glasgow	${\sf scotland}$	
birmingham	england	



## Meaning of free variables

With the cities model, if we set:

$$x = \mathsf{glasgow}$$

$$y = scotland$$

then  $city(x) \wedge within(x, y)$  should be assigned the truth value T.



## Meaning of free variables

With the cities model, if we set:

$$x = \mathsf{glasgow}$$

$$y = scotland$$

then  $city(x) \wedge within(x, y)$  should be assigned the truth value T.

If we set:

$$x = scotland$$

$$y = edinburgh$$

then  $city(x) \wedge within(x, y)$  should be assigned the truth value F.



# **Interpreting Formulas**

#### If we fix:

- **1.** a vocabulary V;
- **2.** a model  $\mathcal{M}$  of that vocabulary;
- 3. an assignment v of elements of U to free variables of P.

then we can give a truth value  $[\![P]\!](\mathcal{M}, \nu)$  to P.



## **Interpreting Formulas**

#### Relations:

$$[\![R(x_1,\ldots,x_n)]\!](\mathcal{M},\nu) = \mathsf{T} \quad \mathrm{if} \quad (\nu(x_1),\ldots,\nu(x_n)) \in \mathrm{R}$$
 
$$= \mathsf{F} \quad \text{otherwise}$$

$$[x = y](\mathcal{M}, v)$$
 = T if  $v(x) = v(y)$   
= F otherwise

where R is one of the relations in  $\mathcal{M}$ .



# **Interpreting Formulas (Example)**

With the cities model  $\mathcal{M}$ :

$$[\![ \mathrm{within}(x,y)]\!](\mathcal{M},[x\mapsto\mathsf{edinburgh},y\mapsto\mathsf{scotland}])=\mathsf{T}$$

 $\llbracket \text{within}(x,y) \rrbracket (\mathcal{M}, [x \mapsto \text{edinburgh}, y \mapsto \text{england}]) = \mathsf{F}$ 



## **Interpreting Formulas**

#### Quantifiers:

Notation  $v[x \mapsto a]$  means the assignment that maps x to a and any other variable to whatever v mapped it to.



# Interpreting Formulas (Example)

$$\llbracket \forall x. \operatorname{city}(x) \rrbracket (\mathcal{M}, \llbracket) = \mathsf{F}$$

because all of the following would need to be T:



# Interpreting Formulas (Example)

$$[\exists x. city(x)](\mathcal{M}, []) = T$$

because only one of the following needs to be T:



## **Interpreting Formulas**

### **Propositional Connectives:**



# **Interpreting Formulas (Example)**

$$[\![\operatorname{city}(x) \land \operatorname{within}(x,y)]\!](\mathcal{M},[x \mapsto \operatorname{edinburgh},y \mapsto \operatorname{scotland}]) = \mathsf{T}$$

and

$$[\![\mathrm{city}(x) \wedge \mathrm{within}(x,y)]\!](\mathcal{M},[x \mapsto \mathsf{edinburgh},y \mapsto \mathsf{birmingham}]) = \mathsf{F}$$

and

$$[\![\operatorname{city}(x) \lor \operatorname{within}(x,y)]\!](\mathcal{M},[x \mapsto \operatorname{edinburgh},y \mapsto \operatorname{birmingham}]) = \mathsf{T}$$

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## Some notation

We write

$$\mathcal{M} \models P$$

when

$$\llbracket P \rrbracket (\mathcal{M}, \llbracket) = \mathsf{T}$$

meaning that  $\mathcal{M}$  is a model of P.

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## Some notation

We write

$$\mathcal{M} \models P$$

when

$$[\![P]\!](\mathcal{M},[\!])=\mathsf{T}$$

meaning that  $\mathcal{M}$  is a model of P.

We write  $\mathcal{M} \not\models P$  if this is not the case.



## **Examples**

If  $\mathcal{M}$  is the cities model, then

$$\mathcal{M} \models \exists x. \text{city}(x)$$
 (there exists a city)

$$\mathcal{M} \not\models \forall x. \text{city}(x)$$
 (not everything is a city)

$$\mathcal{M} \models \forall x. \text{city}(x) \rightarrow (\exists y. \text{within}(x, y))$$
(every city is within something)

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#### **Entailment**

Relative to a model  $\mathcal{M}$ :

$$\mathcal{M}; P_1, \ldots, P_n \models Q$$

exactly when:

if all 
$$[\![P_i]\!](\mathcal{M},[\!]) = T$$
, then  $[\![Q]\!](\mathcal{M},[\!]) = T$ .

If all the assumptions are true, then the conclusion must be true



#### **Entailment**

$$P_1, \ldots, P_n \models Q$$

exactly when for all  $\mathcal{M}$ , we have  $\mathcal{M}; P_1, \ldots, P_n \models Q$ .

Checking this is infeasible (at least naively): there are infinitely many models, and the models themselves may be infinite.

Which is one reason to use proof.



## **Provability and Soundness**

Recall that

$$P_1, \cdots, P_n \vdash Q$$

means that Q is provable from the assumptions  $P_1, \dots, P_n$ .



## **Provability and Soundness**

Recall that

$$P_1, \cdots, P_n \vdash Q$$

means that Q is provable from the assumptions  $P_1, \dots, P_n$ .

The proof system we have used so far is *sound*:

$$P_1, \dots, P_n \vdash Q$$
 implies  $P_1, \dots, P_n \models Q$ 

- If it is provable, then it is true in all models!
- ► Using proof means that we do not need to check infinitely many models, some of which may be infinite themselves.



## Completeness

If we add excluded middle, then the proof system is also *complete*:

$$P_1, \dots, P_n \models Q$$
 implies  $P_1, \dots, P_n \vdash Q$ 

every true entailment has a proof



## Completeness

If we add excluded middle, then the proof system is also *complete*:

$$P_1, \dots, P_n \models Q$$
 implies  $P_1, \dots, P_n \vdash Q$ 

every true entailment has a proof

- ► This is a remarkable and non-trivial fact!
- First proved by Kurt Gödel: "Gödel's Completeness Theorem"
- It also holds if we have infinitely many assumptions  $P_1, \dots,$  which means (because a proof can only use finitely many assumptions) that an entailment only depends on finitely many assumptions: Predicate logic is "compact".



### Summary

We have defined what it means for a Predicate Logic P formula to be true in some model  $\mathcal{M}$ , and entailment in all models.

- Just as with Propositional Logic, this is done by breaking down the formula into its constituent parts
- ▶ Must ensure that all free variables have an interpretation.
- ▶ When a formula is true in some model, we write  $\mathcal{M} \models P$ .
- ► Entailment  $(P_1, ..., P_n \models Q)$  is defined with respect to all models.
- Our proof system is sound and (with excluded middle) complete for this definition of entailment.



## Semantics of Predicate Logic, Part 3 Using Models



## **Using Models**

Some of the things we can do with models:

- **1.** Fix  $\mathcal{M}$ . Does  $\mathcal{M} \models P$ ? *Model checking*
- **2.** Fix  $\mathcal{M}$ . For what P does  $\mathcal{M} \models P$ ? What is true about *this* situation?
- 3. Fix  $\mathcal{M}$ . For what  $a_1, \dots, a_n$  does  $\mathcal{M} \models P[a_1, \dots, a_n]$ ? Database queries
- **4.** Fix formulas  $P_1, ..., P_n$ . Is there a model for them? Generating worlds or counterexamples



## **Using Models: Model Checking**

Given a model  $\mathcal{M}$ , computing  $\mathcal{M} \models P$  works by breaking down the structure of P. For example:

```
Cities \models \exists x. \text{city}(x) \land \text{country}(x)

= [\![\exists x. \text{city}(x) \land \text{country}(x)]\!](\mathcal{M}, [\![]\!])

= some a.[\![\text{city}(x) \land \text{country}(x)]\!](\mathcal{M}, [\![x \mapsto a]\!])

= some a.[\![\text{city}(x)]\!](\mathcal{M}, [\![x \mapsto a]\!]) and [\![\text{country}(x)]\!](\mathcal{M}, [\![x \mapsto a]\!])

= some a.a \in \text{city} and a \in \text{country}

= F (because no such a exists, by checking them all)
```



## **Using Models: Database Queries**

The *Relational Model* is a system for organising data.

- Proposed by Edgar F. Codd in 1969.
- ► Implemented in PostgreSQL, MySQL, SQLite<sup>1</sup>, MS SQL Server, Oracle, IBM DB2, ...
- ► Typically using the Structured Query Language (SQL)
- Built on a logical foundation:
  - 1. Vocabulary  $\approx$  schema
  - **2.** Predicates  $\approx$  (finite) tables
  - 3. Formulas  $\approx$  queries
  - **4.** Models  $\approx$  databases (collections of tables)

<sup>&#</sup>x27;there are at least  $\approx 1000$  SQLite DBs in this room.



## **Using Models: Database Queries**

An SQL query:

SELECT City.X FROM City, Within
WHERE City.X = Within.X AND Within.Y = "scotland"

<sup>&</sup>lt;sup>2</sup>terms and conditions apply



## **Using Models: Database Queries**

An SQL query:

```
SELECT City.X FROM City, Within
WHERE City.X = Within.X AND Within.Y = "scotland"
```

A formula, with free variable x:

$$city(x) \wedge within(x, scotland)$$

The collection of xs that make this formula true in the model is the result of the query<sup>2</sup>. The second half of CS209 introduces SQL.

<sup>&</sup>lt;sup>2</sup>terms and conditions apply



Given a collection of formulas  $P_1, \dots, P_n$ , it is sometimes useful to generate a model  $\mathcal{M}$  for them.

- 1. Sometimes it is easier to think about concrete examples
- 2. Models can be used as counterexamples see later...
- **3.** Can be used to generate interesting things "Generative AI"



- 1.  $\exists x. \exists y. city(x) \land city(y) \land x \neq y$
- **2.**  $\forall x. \text{city}(x) \rightarrow (\exists y. \text{country}(y) \land \text{within}(x, y))$
- 3.  $\forall x. \neg (\text{city}(x) \land \text{country}(x))$



- 1.  $\exists x. \exists y. \text{city}(x) \land \text{city}(y) \land x \neq y$  there exist at least two cities
- **2.**  $\forall x. \text{city}(x) \rightarrow (\exists y. \text{country}(y) \land \text{within}(x, y))$
- 3.  $\forall x. \neg (\text{city}(x) \land \text{country}(x))$



- 1.  $\exists x. \exists y. \text{city}(x) \land \text{city}(y) \land x \neq y$  there exist at least two cities
- 2.  $\forall x. \operatorname{city}(x) \to (\exists y. \operatorname{country}(y) \land \operatorname{within}(x, y))$  every city is in a country
- 3.  $\forall x. \neg (\text{city}(x) \land \text{country}(x))$



- 1.  $\exists x. \exists y. city(x) \land city(y) \land x \neq y$  there exist at least two cities
- 2.  $\forall x. \text{city}(x) \rightarrow (\exists y. \text{country}(y) \land \text{within}(x, y))$  every city is in a country
- 3.  $\forall x. \neg (\text{city}(x) \land \text{country}(x))$  nothing is both a city and a country



First attempt at a model (start minimal):

```
universe = {}
city = {}
country = {}
within = {}
```



First attempt at a model (start minimal):

$$universe = \{\}$$

$$city = \{\}$$

$$country = \{\}$$

$$within = \{\}$$

Does not satisfy  $\exists x.\exists y. \mathrm{city}(x) \land \mathrm{city}(y) \land x \neq y$ Need at least two cities!



Second attempt at a model (the names are arbitrary!):

```
universe = {plockton, auchtermuchty}
city = {plockton, auchtermuchty}
country = {}
within = {}
```



Second attempt at a model (the names are arbitrary!):

```
universe = {plockton, auchtermuchty}
city = {plockton, auchtermuchty}
country = {}
within = {}
```

Satisfies  $\exists x. \exists y. \operatorname{city}(x) \land \operatorname{city}(y) \land x \neq y$ Does not satisfy  $\forall x. \operatorname{city}(x) \rightarrow (\exists y. \operatorname{country}(y) \land \operatorname{within}(x, y))$ Every city needs a country!



#### Third attempt at a model:

```
universe = {plockton, auchtermuchty}
city = {plockton, auchtermuchty}
country = {plockton}
within = {(auchtermuchty, plockton)}
```



#### Third attempt at a model:

```
universe = {plockton, auchtermuchty}
city = {plockton, auchtermuchty}
country = {plockton}
within = {(auchtermuchty, plockton)}
```

Satisfies  $\exists x.\exists y. \operatorname{city}(x) \land \operatorname{city}(y) \land x \neq y$ Does not satisfy  $\forall x. \operatorname{city}(x) \rightarrow (\exists y. \operatorname{country}(y) \land \operatorname{within}(x, y))$ plockton needs to be somewhere!



Fourth attempt at a model:

```
universe = {plockton, auchtermuchty}
city = {plockton, auchtermuchty}
country = {plockton}
within = {(auchtermuchty, plockton), (plockton, plockton)}
```



Fourth attempt at a model:

```
universe = {plockton, auchtermuchty}
city = {plockton, auchtermuchty}
country = {plockton}
within = {(auchtermuchty, plockton), (plockton, plockton)}
```

```
Satisfies \exists x.\exists y. \operatorname{city}(x) \land \operatorname{city}(y) \land x \neq y
Satisfies \forall x. \operatorname{city}(x) \rightarrow (\exists y. \operatorname{country}(y) \land \operatorname{within}(x, y))
Does not satisfy \forall x. \neg (\operatorname{city}(x) \land \operatorname{country}(x))
Nothing can be a city and a country!
```



Fifth attempt at a model:

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#### **Models for Formulas**

Fifth attempt at a model:

```
Satisfies \exists x.\exists y. \operatorname{city}(x) \land \operatorname{city}(y) \land x \neq y
Satisfies \forall x. \operatorname{city}(x) \rightarrow (\exists y. \operatorname{country}(y) \land \operatorname{within}(x, y))
Satisfies \forall x. \neg (\operatorname{city}(x) \land \operatorname{country}(x))
```



Sixth attempt at a model:

```
universe = {plockton, auchtermuchty}
city = {plockton, auchtermuchty}
country = {scotland}
within = {(auchtermuchty, scotland), (plockton, scotland)}
```



Sixth attempt at a model:

```
universe = {plockton, auchtermuchty}
city = {plockton, auchtermuchty}
country = {scotland}
within = {(auchtermuchty, scotland), (plockton, scotland)}
```

```
Satisfies \exists x. \exists y. \operatorname{city}(x) \land \operatorname{city}(y) \land x \neq y
Satisfies \forall x. \operatorname{city}(x) \rightarrow (\exists y. \operatorname{country}(y) \land \operatorname{within}(x, y))
Satisfies \forall x. \neg (\operatorname{city}(x) \land \operatorname{country}(x))
and doesn't have any extra stuff
```



#### General strategy for formulas $P_1, ..., P_n$ :

- 1. See what is forced to exist without conditions (e.g., at least two cities)
- 2. See what is then forced to exist by these things existing (e.g., every city needs a country)
- **3.** Disjointness axioms force non-overlap and more existence (e.g., not a city and a country)
- **4.** Try to keep the model minimal (without the first formula, the empty model would work!)



## **Proof and Counterexamples**

Models can be used to show some formulas are *unprovable*.

Not the same as failing to prove it!



## **Proof and Counterexamples**

Models can be used to show some formulas are *unprovable*.

Not the same as failing to prove it!

To show that there is no proof of  $P_1, ..., P_n \vdash Q$ :

- 1. Find a model  $\mathcal{M}_c$  that makes all of  $\mathcal{M}_c \models P_1, \dots, P_n$ , but  $\mathcal{M}_c \not\models Q$ . ( $\mathcal{M}_c$  is the *countermodel*)
- **2.** *If* we could prove  $P_1, ..., P_n \vdash Q$  then (by soundness):
  - every model  $\mathcal{M}$  such that  $\mathcal{M} \models P_1, ..., P_n$ , then  $\mathcal{M} \models Q$
- **3.** But we have  $\mathcal{M}_c$  that supports  $P_1, ..., P_n$  and **not** Q
- **4.** So  $P_1, ..., P_n \vdash Q$  is **not** provable.

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## Example

It is not possible to prove

$$\neg(\exists x.country(x))$$

from the assumptions:

- 1.  $\exists x. \exists y. \text{city}(x) \land \text{city}(y) \land x \neq y$
- **2.**  $\forall x. \operatorname{city}(x) \rightarrow (\exists y. \operatorname{country}(y) \land \operatorname{within}(x, y))$
- 3.  $\forall x. \neg (\text{city}(x) \land \text{country}(x))$

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from the assumptions:

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- **2.**  $\forall x. \operatorname{city}(x) \rightarrow (\exists y. \operatorname{country}(y) \land \operatorname{within}(x, y))$
- 3.  $\forall x. \neg (\text{city}(x) \land \text{country}(x))$

The model above satisfies all these, but not  $\neg(\exists x.country(x))$ .

Therefore, there is no proof of this formula from these assumptions.



## Summary

Several useful questions can be asked using models:

- **1.** Model checking: does  $\mathcal{M} \models P$ ?
- **2.** Model checking for all values: for what x does  $\mathcal{M} \models P[x]$ ? database queries!
- 3. Model generation for formulas  $P_1, ..., P_n$  can be used to show unprovable things

With sufficiently adapted ideas of "formula" and "model", many questions can be recast in terms of logic and implemented on a computer.