#### L08 – Propositional Logic

#### AIMA4e: 7.3-7.5 (rest of chapter 7 good for context!)

### What you should know after this lecture

- Definition of logic: syntax and semantics
- What is logic good for?
- Propositional logic syntax and semantics
- Inference strategies
  - Model-checking: enumerative and efficient
  - Theorem proving (will do in detail next time)

# Logic: structured representation and proof

- Observations are facts about the world
- Belief is a set of states described in <u>very</u> <u>compact</u> logical language, as the conjunction of observed facts
- Important question:
  - Does my current belief b entail some conclusion φ? That is:
  - Is  $\phi$  guaranteed to be true, if b is?



# What is propositional logic and what is it good for?

- Assume a very large (for now, finite) set of possible states
- <u>Representation is factored</u> into of a set of Boolean state variables, called <u>propositions</u>
- <u>Language</u> for specifying huge sets of states with short descriptions (which ones depends on how we do the formalization)

It is raining  $\wedge\operatorname{Nick}$  is at the beach

• <u>Inference</u> procedures for determining the truth of some statement given the truth of others: <u>semantics-preserving</u> syntactic manipulation. Domain independent!

# Logic, in general

- <u>possible worlds</u>: set of all possible ways the world could be (states of the environment)
- <u>syntax</u>: set of sentences that you can write down on paper; compositionally defined
- <u>semantics</u>: relationship between syntactic sentences and sets of possible worlds; also compositionally defined
- <u>inference</u>: ways of generating new syntactic expressions from given ones, which
  - preserve semantics,
  - no matter what the semantics are!

### Propositional logic syntax

propositional symbols: uppercase letters, True, False

<ul> <li>propositional symbols are sentences</li> </ul>	// Called "atoms"
• if $\alpha$ is a sentence, then $\neg \alpha$ is a sentence	// negation
• if $\alpha$ and $\beta$ are sentences, then	
• $\alpha \lor \beta$ is a sentence	// or
• $\alpha \wedge \beta$ is a sentence	// and
• $\alpha \Rightarrow \beta$ is a sentence	// implies
• $\alpha \Leftrightarrow \beta$ is a sentence	// iff

literal: an atomic sentence or a negated atomic sentence

# Propositional logic models

Can think of this in two steps:

- 1. Imagine a domain (set of possible worlds (environment states)) you'd want to describe (e.g. classrooms of students, or hiking trips, or cars)
- 2. Assign a meaning of each propositional symbol to a subset of that domain that is interesting or important to your problem: e.g.,
  - P: there were more than 10 students
  - Q: there were fewer than 20 students
  - R: the lecturer was witty

For any given possible world and interpretation of the symbols, we end up with

model: propositional symbols  $\rightarrow$  truth value in {*true*, *false*}

### Propositional logic semantics

Model m satisfies sentence  $\alpha$  if and only if one of the following holds:

- $\alpha$  is **True**
- $\alpha$  is a propositional symbol:  $\mathfrak{m}(\alpha) = true$
- $\alpha = \neg \beta$ : m **does not** satisfy  $\beta$
- $\alpha = (\beta \lor \gamma)$ : m satisfies  $\beta$  or m satisfies  $\gamma$
- $\alpha = (\beta \land \gamma)$ : m satisfies  $\beta$  and m satisfies  $\gamma$
- $\alpha = (\beta \Rightarrow \gamma)$ : m satisfies  $\neg \beta$  or m satisfies  $\gamma$
- $\alpha = (\beta \Leftrightarrow \gamma)$ : m satisfies  $\beta \Rightarrow \gamma$  and m satisfies  $\gamma \Rightarrow \beta$

# Logical terminology

- <u>model</u>: a mapping between objects in the syntax and objects in the semantics; also called an <u>interpretation</u>
- satisfies: a model m satisfies a sentence  $\alpha$  if  $\alpha$  is true in m
  - Sometimes (but not in our book) written  $\mathfrak{m} \models \alpha$
  - Sometimes we say m is a model of  $\alpha$
  - Sometimes we say  $\alpha$  holds in m
  - $M(\alpha)$ : set of all models of  $\alpha$
- <u>entails</u>: a sentence  $\alpha$  <u>entails</u> sentence  $\beta$ ,  $\alpha \models \beta$ , if and only if  $\overline{M(\alpha)} \subseteq M(\beta)$
- valid: a sentence is valid if it is satisfied in all models
- <u>unsatisfiable</u>: a sentence is unsatisfiable if it not satisfied in any model
- <u>satisfiable</u>: a sentence is satisfiable if there is at least one model in which it is satisfied

#### Entailment

A sentence  $\alpha$  entails sentence  $\beta$ ,  $\alpha \models \beta$ , if and only if

 $\mathsf{M}(\alpha) \subseteq \mathsf{M}(\beta)$ 

That is, <u>no matter whether you're thinking about hiking trips or</u> classrooms or llamas, and what you think your symbols stand for, any model that satisfies  $\alpha$  will also satisfy  $\beta$ .



### Formalization practice

- *W*: lecturer is witty
- T: more than 10 students in class
- Z: students are asleep
- R: it's raining

Statements:

- 1. If the lecturer is witty, there will be more than 10 students in class.
- 2. If the lecturer is not witty, the students will be asleep.
- 3. More than 10 students will come to class only if it's not raining.

### More formalization practice

AA: Alice admits; BA: Barbara admits; AP: Alice prison; BP Barbara prison

- 1. If both Alice and Barbara admit to having hacked into government computers, then neither of them will receive a prison sentence.
- 2. But if either of them admits to having hacked into a computer while the other doesn't, she will be sentenced to imprisonment while the other won't.
- 3. So unless both don't admit the deed, it cannot happen that both receive a prison sentence.

# Implication and entailment

What is the difference between  $\alpha \Rightarrow \beta$  and  $\alpha \models \beta$ ?

- $\alpha \Rightarrow \beta$  is a sentence in propositional logic.
  - It can be manipulated by a theorem prover.
  - We (mathematicians) can't say whether it's true or false.
  - We can say whether it holds in some model m
- $\alpha \models \beta$  is a mathematical claim.
  - It can't be manipulated by a theorem prover (unless we are trying to encode math in logic (Russell and Whitehead tried this with first-order logic and ran aground.))
  - We (mathematicians) can say whether it's true or false.

Here are some entailments:

- $A \wedge B \models B$
- $A \models A \lor B$
- A ⊭ B
- False  $\models A$
- False |= True
- The only sentence that **True** entails is **True**
- The only sentence that entails **False** is **False**

### Implication and entailment

You can prove (using simple set theory on sets of models):

Theorem *If True*  $\models$  ( $\alpha \Rightarrow \beta$ ) *then*  $\alpha \models \beta$ .

Theorem *If*  $\alpha \models \beta$  *then True*  $\models (\alpha \Rightarrow \beta)$ *.* 

#### Inference

- Given some information (observations) (α) what can I conclude must be true about the world (β)?
- Does α entail β??

Note that we can always take several observed sentences  $\alpha_1, ..., \alpha_k$  and make them into a single sentence

 $\alpha_1 \wedge \ldots \wedge \alpha_n$ 

#### Proof

Generally, a proof procedure takes two sentences,  $\alpha$  and  $\beta$ , and tells you whether it can prove  $\beta$  from  $\alpha$ :

 $\alpha \vdash \beta$ 

Proof procedure is

- sound iff for all  $\alpha$ ,  $\beta$ , if  $\alpha \vdash \beta$  then  $\alpha \models \beta$
- complete iff for all  $\alpha$ ,  $\beta$ , if  $\alpha \models \beta$  then  $\alpha \vdash \beta$

Proof is completely in syntax-land!

# Stupidest possible propositional inference procedure

Recall that a model is an assignment of truth values to propositional symbols; we know the set of symbols for any given domain.

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\begin{array}{l} \mbox{stupid-entailment}(\alpha,\beta) \\ \mbox{for each possible model m:} \\ \mbox{if satisfies}(m,\alpha) \mbox{ and not satisfies}(m,\beta): \\ \mbox{return False} \\ \mbox{return True} \end{array}
```

How many possible models are there? When would this be especially painful?

# Reduction of proof to satisfiability testing

Recall that:

- A sentence is <u>unsatisfiable</u> if it is not true in any model
- If  $\alpha \wedge \neg \beta$  is <u>unsatisfiable</u> then  $\alpha \models \beta$ .

Why??

Sometimes it's easier to think up algorithms for testing <u>satisfiability</u> (SAT). Two strategies:

- Backtracking (DPLL)
- Local search (e.g. simulated annealing, WalkSat, etc.)

### Syntactic proof

Recall, a <u>proof procedure</u> takes two sentences,  $\alpha$  and  $\beta$ , and tells you whether it can prove  $\beta$  from  $\alpha$ :

$$\alpha \vdash \beta$$

Proof procedure is

- sound iff for all  $\alpha$ ,  $\beta$ , if  $\alpha \vdash \beta$  then  $\alpha \models \beta$
- <u>complete</u> iff for all  $\alpha$ ,  $\beta$ , if  $\alpha \models \beta$  then  $\alpha \vdash \beta$

We have looked at proof procedures that operate <u>via</u> enumerating models. But that is inefficient in many cases.

So, we will look at purely <u>syntactic</u> proof, that operates entirely on logical sentences.

### Proof: Inference rules

To prove  $\alpha \models \beta$ :

- Write  $\alpha$  as one or more premises
- Inference rules tell you what you can add to your proof given what you already have. Logic is monotonic.
- When the rules have allowed you to write down β, then you're done.

General inference rule form: If you have  $\alpha$  and  $\beta$  written down in your proof, you can now write  $\gamma$ .

$$\frac{\alpha \quad \beta}{\gamma}$$

Some "natural deduction" inference rules (don't learn these!):

• Modus Ponens

$$\frac{\alpha \Rightarrow \beta \quad \alpha}{\beta}$$

Modus Tollens

$$\frac{\alpha \Rightarrow \beta \quad \neg \beta}{\neg \alpha}$$

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$$\alpha \beta$$
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### One proof strategy: refutation

Proof by refutation:

- To prove  $\alpha \models \beta$
- Instead show that  $\alpha \wedge \neg \beta \models False$

Inference rules:

- Lots of interesting proof systems (sets of inference rules)
- We would like one that is sound and complete:  $(\alpha \vdash \beta) \equiv (\alpha \models \beta)$
- Refutation using the <u>resolution</u> inference rule is sound and complete!!

# Clausal form (conjunctive normal form (CNF))

Many provers first convert all of their input to <u>clausal form</u>, which makes subsequent operations easier.

- 1. Turn all instances of  $\alpha \Leftrightarrow \beta$  into  $(\alpha \Rightarrow \beta) \land (\beta \Rightarrow \alpha)$
- 2. Turn all instances of  $\alpha \Rightarrow \beta$  into  $(\neg \alpha \lor \beta)$
- 3. Push negations all the way "in" using deMorgan's laws:  $\neg(\alpha \land \beta) = (\neg \alpha \lor \neg \beta)$  and  $\neg(\alpha \lor \beta) = (\neg \alpha \land \neg \beta)$
- 4. Distribute  $\lor$  over  $\land$ : convert  $\alpha \lor (\beta \land \gamma)$  to  $(\alpha \lor \beta) \land (\alpha \lor \gamma)$

You end up with a formula of the form

$$(\alpha \lor \beta \lor \ldots) \land (\gamma \lor \delta \lor \ldots) \land \ldots \land (\varepsilon \lor \zeta \lor \ldots)$$

where all the components are <u>literals</u> (negated or non-negated atoms). Elements of the form  $(\alpha \lor \beta \lor \ldots)$  are called <u>clauses</u>.

Check yourself: what do each of these sets of clauses mean?

- { }: The set of no clauses
- {{ }}: The set containing the empty clause

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#### Resolution: One rule to prove them all!

Propositional Resolution (where Q<sub>i</sub> and R<sub>j</sub> are literals):

$$\frac{(P \lor Q_1 \lor \dots, \lor Q_n) \quad (\neg P \lor R_1 \lor \dots \lor R_m)}{(Q_1 \lor \dots \lor Q_n \lor R_1 \lor \dots \lor R_m)}$$

Theorem: Resolution is refutation complete.

If  $\phi \models$  **False** then applying the propositional resolution rule, starting with the clauses in  $\phi$ , until it cannot be applied any further will allow you to derive **False** (the empty clause).

# Resolution refutation example

We know

- I'll go by bus or by train.
- If I go by train, I will be late.
- If I go by bus, I will be late.

In propositional logic

- B ∨ T
- $T \Rightarrow L$
- $B \Rightarrow L$

Can I infer that I will be late (L)?

Negate conclusion conjoin with assumptions, convert to CNF

 $(B \lor T) \land (\neg T \lor L) \land (\neg B \lor L) \land \neg L$ 

### Resolution refutation example, continued

Does this formula entail False?

$$(B \lor T) \land (\neg T \lor L) \land (\neg B \lor L) \land \neg L$$

Proof:

1. $B \lor T$	<b>//</b> assumption
2. ¬T∨L	<b>//</b> assumption
3. $\neg B \lor L$	<b>//</b> assumption
4. ¬L	<b>//</b> assumption
5. ¬T	// 2, 4
6. ¬B	// 3, 4
7. B	<b>//</b> 1, 5
8. False	// 6,7

### **Proof strategies**

Automated proof systems perform a kind of search. Search guidance is important.

• **Unit preference**: Prefer to do a resolution step involving a unit clause (clause with one literal.)

*Produces a shorter clause, which tends to be helpful, because we are trying to produce an empty clause.* 

• Set of support: Prefer to do a resolution step involving the negated goal or any clause derived from the negated goal.

We are trying to produce a contradiction that follows from the negated goal, so these clauses are relevant.

If a contradiction exists, it can always be reached using the set-of-support strategy.

#### The power of False

Can we make formal sense of the idea that you can derive any conclusion from a contradiction?

$$(\mathsf{P} \land \neg \mathsf{P}) \models \mathsf{Z}$$

Does this formula entail False? (Is it unsatisfiable?)

$$P \land \neg P \land \neg Z$$

Proof:

1. P	// assumption
2. ¬P	∥ assumption
3. ¬Z	// assumption
4. False	// 1,2
Yes!	

### Practice example

Prove that these sentences

- $\bullet \ (P \to Q) \to Q$
- $\bullet \ (P \to P) \to R$
- $\bullet \ (R \to S) \to \neg (S \to Q)$

entail R

### Horn clauses can have more efficient inference

A <u>Horn clause</u> is a clause (disjunction of literals) with <u>exactly one</u> positive literal. Here are some:

 $A \land B \land C \Rightarrow D$  $E \land F \Rightarrow A$ B

<u>Prolog</u>: Depth-first backward chaining from a goal conjunction. Basis of <u>logic programming</u> which then adds extra tricks for handling negation, equality, and even side-effects.

## More kinds of logic

- First order: adds to propositional logic
  - variables ranging over objects
  - quantifiers  $\exists$  and  $\forall$
  - Resolution can be generalized to do FOL proofs
- Non-boolean valued: probability, fuzzy, trinary
- Modal:
  - Temporal: always, until, eventually, ....
  - Alethic: necessary, possible
  - Deontic: obligatory, permitted
  - Epistemic:  $K(a, \phi)$  (agent a knows that  $\phi$ )
- Special purpose (usually with efficient inference procedures)
  - Description logic (basically, taxonomies)
  - Reasoning about regular expressions