Propositional Logic

Outline

- I. Syntax and semantics
- II. Truth table enumeration
- III. Theorem proving

^{*} Figures are from the <u>textbook site</u> unless the source is specifically cited.

I. Syntax of Propositional Logic

An atomic sentence is a single proposition symbol.

standing for a proposition that has to be either true or false but not both.

 $P, Q, R, W_{1,3}$, FacingEast

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True: always-true proposition *False*: always-false proposition

A *complex sentence* is constructed from simpler sentences, using parentheses and *logical connectives* (5 in total).

- ¬ (not).
 - ◆ ¬*P* is the *negation* of *P*.
 - Iiteral: either an atomic sentence or a negated atomic sentence.

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- Λ (and).
 - $W_{1,3} \wedge P_{3,1}$ is a *conjunction* whose parts $W_{1,3}$ and $P_{3,1}$ are *conjuncts*.

There is a pit in [3,1].

A *complex sentence* is constructed from simpler sentences, using parentheses and *logical connectives* (5 in total).

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- V (or).
 - $(W_{1,3} \land P_{3,1}) \lor W_{2,2}$ is a *disjunction* whose parts $(W_{1,3} \land P_{3,1})$ and $W_{2,2}$ are *disjuncts*.

- \rightarrow (implies).
 - $(W_{1,3} \land P_{3,1}) \Rightarrow \neg W_{2,2}$ is an *implication*.

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premise or antecedent conclusion or consequent

- $\bullet \Leftrightarrow$ (if and only if).
 - $W_{1,3} \Leftrightarrow W_{2,2}$ is a biconditional.

Grammar of Propositional Logic



John Backus (IBM)
National Medal of Science (1975)
ACM Turing Award (1977)



Peter Naur (U. Copenhagen) ACM Turing Award (2005)

Backus-Naur form (BNF):

```
Sentence 
ightarrow AtomicSentence \mid ComplexSentence
AtomicSentence 
ightarrow True \mid False \mid P \mid Q \mid R \mid \dots
ComplexSentence 
ightarrow (Sentence)
\mid \neg Sentence
\mid Sentence \land Sentence
\mid Sentence \lor Sentence
\mid Sentence \Leftrightarrow Sentence
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```

OPERATOR PRECEDENCE : $\neg, \land, \lor, \Rightarrow, \Leftrightarrow$

^{*} Photos from https://amturing.acm.org/byyear.cfm.

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OPERATOR PRECEDENCE : $\neg, \land, \lor, \Rightarrow, \Leftrightarrow$

$$\neg A \lor B \land C \Rightarrow D$$
 is equivalent to
$$((\neg A) \lor (B \land C)) \Rightarrow D$$

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Semantics

A model fixes the truth value (*true* or *false*) for every proposition symbols.

$$m_1 = \{P_{1,2} = false, P_{2,2} = false, P_{3,1} = true\}$$

 $m_2 = \{P_{1,2} = true, P_{2,2} = false, P_{3,1} = true\}$

Semantics defines the rules for determining the truth of a sentence w.r.t. any model.

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Semantics defines the rules for determining the truth of a sentence w.r.t. any model.

The truth value of any sentence can be computed once we know

- how to evaluate the truth of atomic sentences;
- how to compute the truth of sentences formed with each of the five connectives.

Determining the Truth Value

Atomic sentences:

- true is true in every model.
- ◆ false is false in every model.
- ◆ The truth value of every other proposition symbol must be specified in a model m.

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Complex sentences in the model m:

- $\bullet \neg P$ is true iff P is false.
- $P \wedge Q$ is true iff P and Q are true.
- $P \vee Q$ is true iff either P or Q is true.
- $P \Rightarrow Q$ is true unless P is true and Q is false.
- $P \Leftrightarrow Q$ is true iff P and Q are both true or both false.

P	Q	$\neg P$	$P \wedge Q$	$P \vee Q$	$P \Rightarrow Q$	$P \Leftrightarrow Q$
false false true true	$false \ true \ false \ true$	true true false false	$false \\ false \\ false \\ true$	$false \ true \ true \ true$	$true \ true \ false \ true$	$true \\ false \\ false \\ true$

P	Q	$\neg P$	$P \wedge Q$	$P \vee Q$	$P \Rightarrow Q$	$P \Leftrightarrow Q$
$false \\ false \\ true \\ true$	$false \ true \ false \ true$	$true \ true \ false \ false$	$false \\ false \\ false \\ true$	$false \ true \ true \ true$	$true \ true \ false \ true$	$true \ false \ false \ true$

In the model $m_1 = \{P_{1,2} = \textit{false}, P_{2,2} = \textit{false}, P_{3.1} = \textit{true}\}$

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In the model
$$m_1=\{P_{1,2}=\textit{false},P_{2,2}=\textit{false},P_{3.1}=\textit{true}\}$$
 No pit in [1,2].

P	Q	$\neg P$	$P \wedge Q$	$P \lor Q$	$P \Rightarrow Q$	$P \Leftrightarrow Q$
false false true	$false \ true \ false$	$true \ true \ false$	$false \\ false \\ false$	$false \ true \ true$	$true \ true \ false$	$true \\ false \\ false$
true	true	false	true	true	true	true

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$false \\ false \\ true \\ true$	$false \ true \ false \ true$	$true \ true \ false \ false$	$false \\ false \\ false \\ true$	$false \ true \ true \ true$	$true \ true \ false \ true$	$true \ false \ false \ true$

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$$= true \land true$$

$$= true$$

Knowledge Base for the Wumpus World

Proposition symbols

- $P_{x,y}$ is true if there is a pit in [x, y].
- $W_{x,y}$ is true if there is a wumpus in [x, y], dead or alive.
- $B_{x,y}$ is true if the agent perceives a breeze in [x,y].
- $S_{x,y}$ is true if the agent perceives a stench in [x,y].

SSSSSS StenchS

Breeze

PIT

Breeze

SSSSSS

StenchS

Breeze

PIT

Breeze

PIT

Breeze

PIT

Breeze

1

3

2

- General knowledge (partial only for relevant squares):
 - There is no pit in [1,1].

$$R_1: \neg P_{1,1}$$

SSSSSSPIT

Breeze

PIT

Breeze

PIT

Breeze

1

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PIT

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A square is breezy if and only if a neighboring square has a pit.

 R_2 : $B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$

 R_3 : $B_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$

SSSSS Stench		-Breeze -	PIT
1000	SSSSS Stench S	PIT	-Breeze
SSTSS Stench		Breeze	
START	-Breeze	PIT	Breeze

1

3

2

1

3

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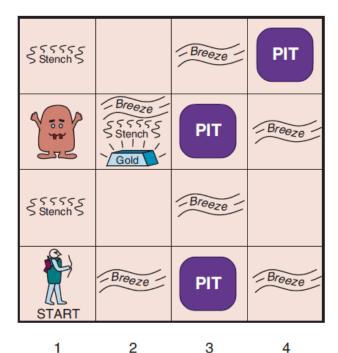
$$R_2$$
: $B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$

$$R_3$$
: $B_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$

Percepts for the first two squares:

$$R_4$$
: $\neg B_{1,1}$

$$R_5: B_{2,1}$$



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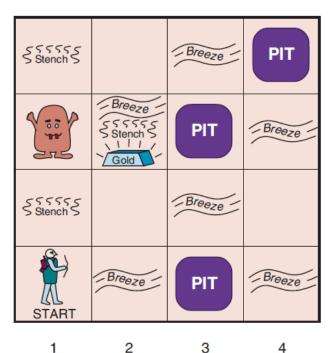
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1

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Enumerate the models of KB and check if $\neg P_{1,2}$ is true in every model.

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Relevant propositions: $B_{1,1}$, $B_{2,1}$, $P_{1,1}$, $P_{1,2}$, $P_{2,1}$, $P_{2,2}$, $P_{3,1}$

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Relevant propositions: $B_{1,1}$, $B_{2,1}$, $P_{1,1}$, $P_{1,2}$, $P_{2,1}$, $P_{2,2}$, $P_{3,1}$



 $2^7 = 128$ possible models!

Truth Table Enumeration

	$B_{1,1}$	$B_{2,1}$	$P_{1,1}$	$P_{1,2}$	$P_{2,1}$	$P_{2,2}$	$P_{3,1}$	R_1	R_2	R_3	R_4	R_5	KB
	false false	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	$false \ true$	$true \ true$	$true \ true$	$true \\ false$	$true \ true$	$false \\ false$	$false \ false$
28 ws	: false	\vdots $true$: false	: false	\vdots $false$	\vdots $false$: false	$\vdots\\ true$	\vdots $true$	\vdots $false$	$\vdots\\ true$	$\vdots\\ true$: false
	false false false	true true true	false false false	false false false	false false false	false true true	true false true	true true true	true true true	true true true	true true true	true true true	$\frac{true}{true}$ \underline{true}
	false : true	true : true	false : true	false : true	true : true	false : true	false : true	true : false	false : true	false : true	true : false	true : true	false : false

128 rows

Truth Table Enumeration

KB is true in only 3 models.

	$B_{1,1}$	$B_{2,1}$	$P_{1,1}$	$P_{1,2}$	$P_{2,1}$	$P_{2,2}$	$P_{3,1}$	R_1	R_2	R_3	R_4	R_5	KB
	false false	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	$false \ true$	$true \ true$	$true \ true$	$true \\ false$	$true \ true$	$false \\ false$	$false \ false$
28 ws	: false	\vdots $true$: false	: false	: false	\vdots $false$: false	$\vdots\\ true$	$\vdots \\ true$	\vdots $false$	$\vdots \\ true$	$\vdots\\ true$: false
	false false false	true true true	false false false	false false false	false false false	false true true	true false true	true true true	true true true	true true true	true true true	true true true	true true true
	false : true	true : true	false : true	false : true	true : true	false : true	false : true	true : false	false : true	false : true	true : false	true : true	false : false

128 rows

Truth Table Enumeration

KB is true in only 3 models.

 $\neg P_{1,2}$ is true in all 3.

	$B_{1,1}$	$B_{2,1}$	$P_{1,1}$	$P_{1,2}$	$P_{2,1}$	$P_{2,2}$	$P_{3,1}$	R_1	R_2	R_3	R_4	R_5	KB
	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	$false \ true$	$true \ true$	$true \ true$	$true \\ false$	$true \ true$	$false \\ false$	$false \\ false$
28 ws	: false	\vdots $true$: false	: false	: false	: false	: false	$\vdots\\ true$	$\vdots \\ true$	\vdots $false$	$\vdots \\ true$	$\vdots \\ true$: false
	false false false	true true true	false false false	false false false	false false false	false true true	true false true	true true true	true true true	true true true	true true true	true true true	true true true
	false : true	true : true	false : true	false : true	true : true	false : true	false : true	true : false	false : true	false : true	true : false	true : true	false : false

128 rows

Truth Table Enumeration

KB is true in only 3 models.
$$\neg P_{1,2}$$
 is true in all 3.

 D_{i} , D_{i} , D_{0} , D_{0}

	$D_{1,1}$	$D_{2,1}$	$P_{1,1}$	$P_{1,2}$	$P_{2,1}$	$P_{2,2}$	$P_{3,1}$	κ_1	R_2	R_3	R_4	R_5	KD
	false false	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	$false \ true$	$true \ true$	$true \ true$	$true \\ false$	$true \ true$	$false \\ false$	$false \\ false$
28 ws	: false	$\vdots \\ true$	$\vdots \\ false$: false	: false	: false	: false	$\vdots \\ true$	$\vdots \\ true$: false	$\vdots \\ true$	$\vdots \\ true$: false
	false false false	true true true	false false false	false false false	false false false	false true true	true false true	true true true	true true true	true true true	true true true	true true true	true true true
	false : true	true : true	false : true	false : true	true : true	false : true	false : true	true : false	false : true	false : true	true : false	true : true	false : false

 D_{α} .

 R_{4}

 R_{\circ}

 R_{o}

R.

 R_{\star}

KR

128 rows

Truth Table Enumeration

KB is true in only 3 models.
$$\neg P_{1,2}$$
 is true in all 3.

 $P_{2,2}$ is true in only 2 of 3.

	$B_{1,1}$	$B_{2,1}$	$P_{1,1}$	$P_{1,2}$	$P_{2,1}$	$P_{2,2}$	$P_{3,1}$	R_1	R_2	R_3	R_4	R_5	KB
	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	$false \ true$	$true \ true$	$true \ true$	$true \\ false$	$true \ true$	$false \\ false$	$false \\ false$
8 vs	: false	$\vdots \\ true$: false	: false	: false	: false	: false	$\vdots \\ true$	$\vdots \\ true$: false	$\vdots \\ true$	$\vdots \\ true$: false
	false false false	true true true	false false false	false false false	false false false	false true true	true false true	true true true	true true true	true true true	true true true	true true true	$\frac{true}{true}$
	false : true	true : true	false : true	false : true	true : true	false : true	false : true	true : false	false : true	false : true	true : false	true : true	false : false

128 rows

Truth Table Enumeration

KB is true in only 3 models.
$$\neg P_{1,2}$$
 is true in all 3.

 $P_{2,2}$ is true in only 2 of 3. \square No inference of $KB \models P_{2,2}$

	$B_{1,1}$	$B_{2,1}$	$P_{1,1}$	$P_{1,2}$	$P_{2,1}$	$P_{2,2}$	$P_{3,1}$	R_1	R_2	R_3	R_4	R_5	KB
	$false \\ false$	$false \\ false$	$false \\ false$	$false \\ false$	false $false$	$false \\ false$	false $true$	$true \ true$	$true \ true$	$true \\ false$	$true \ true$	$false \\ false$	$false \\ false$
8 vs	: false	$\vdots \\ true$: false	: false	: false	\vdots $false$: false	$\vdots \\ true$	$\vdots \\ true$	\vdots $false$	$\vdots \\ true$	$\vdots\\ true$: false
	false false false	true true true	false false false	false false false	false false false	false true true	true false true	true true true	true true true	true true true	true true true	true true true	$\frac{true}{true}$
	false	true	false	false	true	false	false	true :	false	false	true	true	false
	true	true	true	true	true	true	true	false	true	true	false	true	false

128 rows

Bad News

Suppose KB and α have n symbols. \Longrightarrow 2^n models!

The propositional entailment problem of showing $KB \models \alpha$ by truth table enumeration requires

 $\Theta(2^n n)$ time

O(n) space (not bad)

The problem is co NP-complete (likely not easier than NP-complete).

Theorem proving: Apply rules of inference directly to the sentences in KB to construct a proof of a sentence without consulting models.

Two sentences α and β are *logically equivalent* if $M(\alpha) = M(\beta)$. $(\alpha \equiv \beta)$

Two sentences
$$\alpha$$
 and β are *logically equivalent* if $M(\alpha) = M(\beta)$.
$$(\alpha \equiv \beta)$$
set of models for α

```
Two sentences \alpha and \beta are logically equivalent if M(\alpha) = M(\beta). (\alpha \equiv \beta) | \alpha \equiv \beta if and only if \alpha \models \beta and \beta \models \alpha. set of models for \alpha
```

```
Two sentences \alpha and \beta are logically equivalent if M(\alpha) = M(\beta).
                                                                         (\alpha \equiv \beta)
                                                                                                             set of models for \alpha
                \alpha \equiv \beta if and only if \alpha \models \beta and \beta \models \alpha.
                               (\alpha \wedge \beta) \equiv (\beta \wedge \alpha) commutativity of \wedge
                               (\alpha \vee \beta) \equiv (\beta \vee \alpha) commutativity of \vee
                     ((\alpha \wedge \beta) \wedge \gamma) \equiv (\alpha \wedge (\beta \wedge \gamma)) associativity of \wedge
                     ((\alpha \vee \beta) \vee \gamma) \equiv (\alpha \vee (\beta \vee \gamma)) associativity of \vee
                                \neg(\neg \alpha) \equiv \alpha double-negation elimination
                           (\alpha \Rightarrow \beta) \equiv (\neg \beta \Rightarrow \neg \alpha) contraposition
                           (\alpha \Rightarrow \beta) \equiv (\neg \alpha \lor \beta) implication elimination
                           (\alpha \Leftrightarrow \beta) \equiv ((\alpha \Rightarrow \beta) \land (\beta \Rightarrow \alpha)) biconditional elimination
                            \neg(\alpha \land \beta) \equiv (\neg \alpha \lor \neg \beta) De Morgan
                            \neg(\alpha \lor \beta) \equiv (\neg \alpha \land \neg \beta) De Morgan
                     (\alpha \wedge (\beta \vee \gamma)) \equiv ((\alpha \wedge \beta) \vee (\alpha \wedge \gamma)) distributivity of \wedge over \vee
                     (\alpha \vee (\beta \wedge \gamma)) \equiv ((\alpha \vee \beta) \wedge (\alpha \vee \gamma)) distributivity of \vee over \wedge
```

Validity

A sentence is *valid* if it is true in all models.

$$P \vee \neg P$$

Valid sentences are *tautologies*.

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\alpha\alpha \Rightarrow \beta\beta) is valid.

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if and only if the sentence (\alpha \Rightarrow \beta) is valid.

if and only if the sentence (\alpha \Rightarrow \beta) is valid.
```

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A sentence is *valid* if it is true in all models.

$$P \vee \neg P$$

Valid sentences are *tautologies*.

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\alpha\alpha\Rightarrow\beta\beta) is valid. \alpha\alpha\Rightarrow\beta\beta) is valid. if and only if the sentence (\alpha\Rightarrow\beta) is valid. If and only if the sentence (\alpha\Rightarrow\beta) is valid. It and only if the sentence (\alpha\Rightarrow\beta) is valid. It and only if the sentence (\alpha\Rightarrow\beta) is valid.
```

A sentence is *satisfiable* if it is true in, or satisfied by, some model.

R_1	R_2	R_3	R_4	R_5	KB
true true		true false		false	•
 true		false			false
	true	true true true	true	true	\overline{true}
÷	:	false : true	÷	÷	:

 $(R_1 \wedge R_2 \wedge R_3 \wedge R_4 \wedge R_5)$ is satisfiable.

A sentence is *satisfiable* if it is true in, or satisfied by, some model.

R_1	R_2	R_3	R_4	R_5	KB
				false $false$	
:	÷	:	:	:	:
				true true	
true	true	true	true	true true	\underline{true}
true	false	false	true	true	false
: false				\vdots $true$	

 $(R_1 \wedge R_2 \wedge R_3 \wedge R_4 \wedge R_5)$ is satisfiable.

The SAT problem: Determining the satisfiability of sentences in propositional logic.

A sentence is *satisfiable* if it is true in, or satisfied by, some model.

R_1	R_2	R_3	R_4	R_5	KB
true		true			•
true	true.	false		•	false
: $true$	true	: false	\vdots $true$		false
true	true	true	true	true	\underline{true}
		true $true$			
true	false	false	true	true	false
:	÷	÷	÷	:	÷
false	true	true			false

 $(R_1 \wedge R_2 \wedge R_3 \wedge R_4 \wedge R_5)$ is satisfiable.

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first NP-complete problem

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	R_1	R_2	R_3	R_4	R_5	KB
	true		true			•
	true .	true	false			false .
	$: \\ true$	true	\vdots $false$			false
•••	true	true	true	true	true	\underline{true}
			true $true$			
	true	false	false	true	true	false
	÷	÷	÷	÷	:	÷
	false	true	true	false	true	false

 $(R_1 \wedge R_2 \wedge R_3 \wedge R_4 \wedge R_5)$ is satisfiable.

The SAT problem: Determining the satisfiability of sentences in propositional logic.

first NP-complete problem

 $\alpha \models \beta$ if and only if the sentence $(\alpha \land \neg \beta)$ is unsatisfiable.

A sentence is *satisfiable* if it is true in, or satisfied by, some model.

R_1	R_2	R_3	R_4	R_5	KB
	true $true$				
÷		:	÷	:	:
true	true true true	true	true	true	true
÷	false : true	:	÷	÷	:

 $(R_1 \wedge R_2 \wedge R_3 \wedge R_4 \wedge R_5)$ is satisfiable.

The SAT problem: Determining the satisfiability of sentences in propositional logic.

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Proof by contradiction

 $\alpha \models \beta$ if and only if the sentence $(\alpha \land \neg \beta)$ is unsatisfiable.

Inference Rules

Modus Ponens

$$\frac{\alpha \Rightarrow \beta, \qquad \alpha}{\beta}$$

$$\alpha \Rightarrow \beta$$

If today is Tuesday, then John will go to campus.

Today is Tuesday.

Therefore, John will go to campus.

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Modus Ponens

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And-elimination

$$\frac{\alpha \wedge \beta}{\alpha}$$

$$\alpha$$
 \wedge

A star is a sphere of gas, and it is held together by its own gravity.

A star is a sphere of gas.

```
(\alpha \land \beta) \equiv (\beta \land \alpha) \quad \text{commutativity of} \land \\ (\alpha \lor \beta) \equiv (\beta \lor \alpha) \quad \text{commutativity of} \lor \\ ((\alpha \land \beta) \land \gamma) \equiv (\alpha \land (\beta \land \gamma)) \quad \text{associativity of} \land \\ ((\alpha \lor \beta) \lor \gamma) \equiv (\alpha \lor (\beta \lor \gamma)) \quad \text{associativity of} \lor \\ \neg(\neg \alpha) \equiv \alpha \quad \text{double-negation elimination} \\ (\alpha \Rightarrow \beta) \equiv (\neg \beta \Rightarrow \neg \alpha) \quad \text{contraposition} \\ (\alpha \Rightarrow \beta) \equiv (\neg \alpha \lor \beta) \quad \text{implication elimination} \\ (\alpha \Leftrightarrow \beta) \equiv ((\alpha \Rightarrow \beta) \land (\beta \Rightarrow \alpha)) \quad \text{biconditional elimination} \\ \neg(\alpha \land \beta) \equiv (\neg \alpha \lor \neg \beta) \quad \text{De Morgan} \\ \neg(\alpha \lor \beta) \equiv (\neg \alpha \land \neg \beta) \quad \text{De Morgan} \\ (\alpha \land (\beta \lor \gamma)) \equiv ((\alpha \land \beta) \lor (\alpha \land \gamma)) \quad \text{distributivity of} \land \text{ over} \lor \\ (\alpha \lor (\beta \land \gamma)) \equiv ((\alpha \lor \beta) \land (\alpha \lor \gamma)) \quad \text{distributivity of} \lor \text{ over} \land \\ \end{cases}
```

```
(\alpha \wedge \beta) \equiv (\beta \wedge \alpha) commutativity of \wedge
          (\alpha \vee \beta) \equiv (\beta \vee \alpha) commutativity of \vee
((\alpha \wedge \beta) \wedge \gamma) \equiv (\alpha \wedge (\beta \wedge \gamma)) associativity of \wedge
((\alpha \vee \beta) \vee \gamma) \equiv (\alpha \vee (\beta \vee \gamma)) associativity of \vee
            \neg(\neg \alpha) \equiv \alpha double-negation elimination
      (\alpha \Rightarrow \beta) \equiv (\neg \beta \Rightarrow \neg \alpha) contraposition
      (\alpha \Rightarrow \beta) \equiv (\neg \alpha \lor \beta) implication elimination
      (\alpha \Leftrightarrow \beta) \equiv ((\alpha \Rightarrow \beta) \land (\beta \Rightarrow \alpha)) biconditional elimination
       \neg(\alpha \land \beta) \equiv (\neg \alpha \lor \neg \beta) De Morgan
       \neg(\alpha \lor \beta) \equiv (\neg \alpha \land \neg \beta) De Morgan
(\alpha \wedge (\beta \vee \gamma)) \equiv ((\alpha \wedge \beta) \vee (\alpha \wedge \gamma)) distributivity of \wedge over \vee
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                              \neg(\alpha \lor \beta)
```

```
(\alpha \wedge \beta) \equiv (\beta \wedge \alpha) commutativity of \wedge
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(\alpha \wedge (\beta \vee \gamma)) \equiv ((\alpha \wedge \beta) \vee (\alpha \wedge \gamma)) distributivity of \wedge over \vee
(\alpha \vee (\beta \wedge \gamma)) \equiv ((\alpha \vee \beta) \wedge (\alpha \vee \gamma)) distributivity of \vee over \wedge
                          \frac{\neg(\alpha \lor \beta)}{\neg\alpha \land \neg\beta}
                                                                               De Morgan
```

```
(\alpha \wedge \beta) \equiv (\beta \wedge \alpha) \quad \text{commutativity of } \wedge \\ (\alpha \vee \beta) \equiv (\beta \vee \alpha) \quad \text{commutativity of } \vee \\ ((\alpha \wedge \beta) \wedge \gamma) \equiv (\alpha \wedge (\beta \wedge \gamma)) \quad \text{associativity of } \wedge \\ ((\alpha \vee \beta) \vee \gamma) \equiv (\alpha \vee (\beta \vee \gamma)) \quad \text{associativity of } \vee \\ \neg(\neg \alpha) \equiv \alpha \quad \text{double-negation elimination} \\ (\alpha \Rightarrow \beta) \equiv (\neg \beta \Rightarrow \neg \alpha) \quad \text{contraposition} \\ (\alpha \Rightarrow \beta) \equiv (\neg \alpha \vee \beta) \quad \text{implication elimination} \\ (\alpha \Leftrightarrow \beta) \equiv ((\alpha \Rightarrow \beta) \wedge (\beta \Rightarrow \alpha)) \quad \text{biconditional elimination} \\ \neg(\alpha \wedge \beta) \equiv (\neg \alpha \vee \neg \beta) \quad \text{De Morgan} \\ \neg(\alpha \vee \beta) \equiv (\neg \alpha \wedge \neg \beta) \quad \text{De Morgan} \\ (\alpha \wedge (\beta \vee \gamma)) \equiv ((\alpha \wedge \beta) \vee (\alpha \wedge \gamma)) \quad \text{distributivity of } \wedge \text{ over } \vee \\ (\alpha \vee (\beta \wedge \gamma)) \equiv ((\alpha \vee \beta) \wedge (\alpha \vee \gamma)) \quad \text{distributivity of } \vee \text{ over } \wedge \\ \end{pmatrix}
```

$$\frac{\neg(\alpha \lor \beta)}{\neg \alpha \land \neg \beta}$$
 De Morgan and-elimination

KB:

$$R_1: \neg P_{1,1}$$

$$R_1: \neg P_{1,1}$$
 $R_2: B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$

$$R_3: B_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$$

$$R_4$$
: $\neg B_{1,1}$

$$R_5$$
: $B_{2,1}$

KB:

$$R_1: \neg P_{1,1}$$

$$R_1: \neg P_{1,1} \qquad \qquad R_2: B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$$

$$R_3$$
: $B_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$

$$R_4$$
: $\neg B_{1,1}$

$$R_5$$
: $B_{2,1}$

Proof for $\neg P_{1,2}$

KB:

$$R_1: \neg P_{1,1}$$

$$R_1: \neg P_{1,1}$$
 $R_2: B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$ $R_3: B_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$

$$R_4$$
: $\neg B_{1,1}$ R_5 : $B_{2,1}$

Proof for
$$\neg P_{1,2}$$

$$R_2$$
: $B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$

KB:

$$R_1: \neg P_{1,1}$$
 $R_2: B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$ $R_4: \neg B_{1,1}$ $R_3: B_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$ $R_5: B_{2,1}$

Proof for $\neg P_{1,2}$

$$\frac{R_2 \colon B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})}{R_6 \colon \left(B_{1,1} \Rightarrow \left(P_{1,2} \vee P_{2,1}\right)\right) \wedge \left(\left(P_{1,2} \vee P_{2,1}\right) \Rightarrow B_{1,1}\right)} \text{ biconditional elimination}$$

 R_7 : $(P_{1.2} \lor P_{2.1}) \Rightarrow B_{1.1}$

KB:

$$R_1: \neg P_{1,1}$$
 $R_2: B_{1,1} \Leftrightarrow (P_{1,2} \lor P_{2,1})$ $R_3: B_{2,1} \Leftrightarrow (P_{1,1} \lor P_{2,2} \lor P_{3,1})$

 R_4 : $\neg B_{1,1}$

 R_5 : $B_{2,1}$

Proof for $\neg P_{1,2}$

$$R_{6}: \ \left(B_{1,1} \Leftrightarrow \left(P_{1,2} \vee P_{2,1}\right)\right) \land \left(\left(P_{1,2} \vee P_{2,1}\right) \Rightarrow B_{1,1}\right)$$
 biconditional elimination and-elimination

KB:

$$R_1: \neg P_{1,1}$$

$$R_2: B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$$

$$R_3$$
: $B_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$

$$R_4$$
: $\neg B_{1,1}$

$$R_5$$
: $B_{2,1}$

Proof for $\neg P_{1,2}$

$$R_2$$
: $B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$

biconditional elimination

$$R_6: (B_{1,1} \Rightarrow (P_{1,2} \lor P_{2,1})) \land ((P_{1,2} \lor P_{2,1}) \Rightarrow B_{1,1})$$

and-elimination

$$R_7: (P_{1,2} \vee P_{2,1}) \Rightarrow B_{1,1}$$

logical equivalence

$$R_8$$
: $\neg B_{1,1} \Rightarrow \neg (P_{1,2} \lor P_{2,1})$

KB:

$$R_1: \neg P_{1,1}$$

$$R_2: B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$$

$$R_3 \colon B_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$$

 R_4 : $\neg B_{1.1}$

$$R_5$$
: $B_{2,1}$

Proof for $\neg P_{1,2}$

$$R_2$$
: $B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$

biconditional elimination

$$R_6: (B_{1,1} \Rightarrow (P_{1,2} \lor P_{2,1})) \land ((P_{1,2} \lor P_{2,1}) \Rightarrow B_{1,1})$$

$$R_7$$
: $(P_{1,2} \lor P_{2,1}) \Rightarrow B_{1,1}$

logical equivalence

$$R_4$$
: $\neg B_{1,1}$

$$R_4: \neg B_{1,1} \qquad R_8: \neg B_{1,1} \Rightarrow \neg (P_{1,2} \lor P_{2,1})$$

KB:

$$R_1: \neg P_{1,1}$$
 $R_2: B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$

 $R_3: B_{2,1} \Leftrightarrow (P_{1,1} \vee P_{2,2} \vee P_{3,1})$

Proof for $\neg P_{1,2}$

$$R_{2} \colon B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$$

$$R_{6} \colon \left(B_{1,1} \Rightarrow \left(P_{1,2} \vee P_{2,1}\right)\right) \wedge \left(\left(P_{1,2} \vee P_{2,1}\right) \Rightarrow B_{1,1}\right)$$

 R_7 : $(P_{1,2} \lor P_{2,1}) \Rightarrow B_{1,1}$

 $R_4: \neg B_{1,1} \qquad R_8: \neg B_{1,1} \Rightarrow \neg (P_{1,2} \lor P_{2,1})$

 R_9 : $\neg (P_{1,2} \lor P_{2,1})$

biconditional elimination

and-elimination

 R_4 : $\neg B_{1.1}$

 R_5 : $B_{2.1}$

logical equivalence

modus ponens

KB:

$$R_1: \neg P_{1,1}$$

$$R_2: B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$$

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 R_4 : $\neg B_{1,1}$

$$R_5$$
: $B_{2,1}$

Proof for $\neg P_{1,2}$

$$R_2$$
: $B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$

biconditional elimination

$$R_6 \colon \left(B_{1,1} \Rightarrow \left(P_{1,2} \vee P_{2,1} \right) \right) \wedge \left(\left(P_{1,2} \vee P_{2,1} \right) \Rightarrow B_{1,1} \right)$$

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$$R_9: \neg (P_{1,2} \lor P_{2,1})$$

 $R_{10}: \neg P_{1,2} \wedge \neg P_{2,1}$

KB:

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 R_4 : $\neg B_{1.1}$

$$R_5$$
: $B_{2,1}$

Proof for $\neg P_{1,2}$

$$R_2$$
: $B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$

$$\begin{array}{c} \mathbf{t_2}. \ B_{1,1} \hookrightarrow (\mathbf{r}_{1,2} \vee \mathbf{r}_{2,1}) \end{array}$$

$$R_6: (B_{1,1} \Rightarrow (P_{1,2} \lor P_{2,1})) \land ((P_{1,2} \lor P_{2,1}) \Rightarrow B_{1,1})$$

$$R_7$$
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$$R_9$$
: $\neg (P_{1,2} \lor P_{2,1})$

$$R_{10}: \neg P_{1,2} \wedge \neg P_{2,1}$$

$$R_{11}$$
: $\neg P_{1,2}$

biconditional elimination

and-elimination

logical equivalence

modus ponens

De Morgan's rule

and-elimination

KB:

$$R_1: \neg P_{1,1}$$

$$R_2: B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$$

$$R_3$$
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 R_4 : $\neg B_{1.1}$

$$R_5$$
: $B_{2,1}$

Proof for $\neg P_{1,2}$

$$R_2$$
: $B_{1,1} \Leftrightarrow (P_{1,2} \vee P_{2,1})$

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biconditional elimination

and-elimination

logical equivalence

modus ponens

De Morgan's rule

and-elimination



- Initial State: the initial KB.
- ACTIONS: Apply any inference rule to any sentence that matches its top half.
- Result: Add the sentence in the bottom half of the inference rules.
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 - ♠ The truth-table algorithm runs in time $\Theta(2^n n)$ always the worst case.
 - ♣ Search takes time $O(2^n n)$ often not the worst case.

The set of entailed sentences can only *increase* as new information is added to the KB.

if
$$KB \models \alpha$$
 then $KB \land \beta \models \alpha$

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