

Propositional Logic

Russell and Norvig:
Chapter 7, Sections 7.1 – 7.5.1

Slides by Jean-Claude Latombe, from an introductory AI course given at Stanford University. Used (and adapted) with permission.

Important Concepts in AI

- ◆ The Representation of Knowledge about the world
- ◆ The Reasoning Process to make use of it

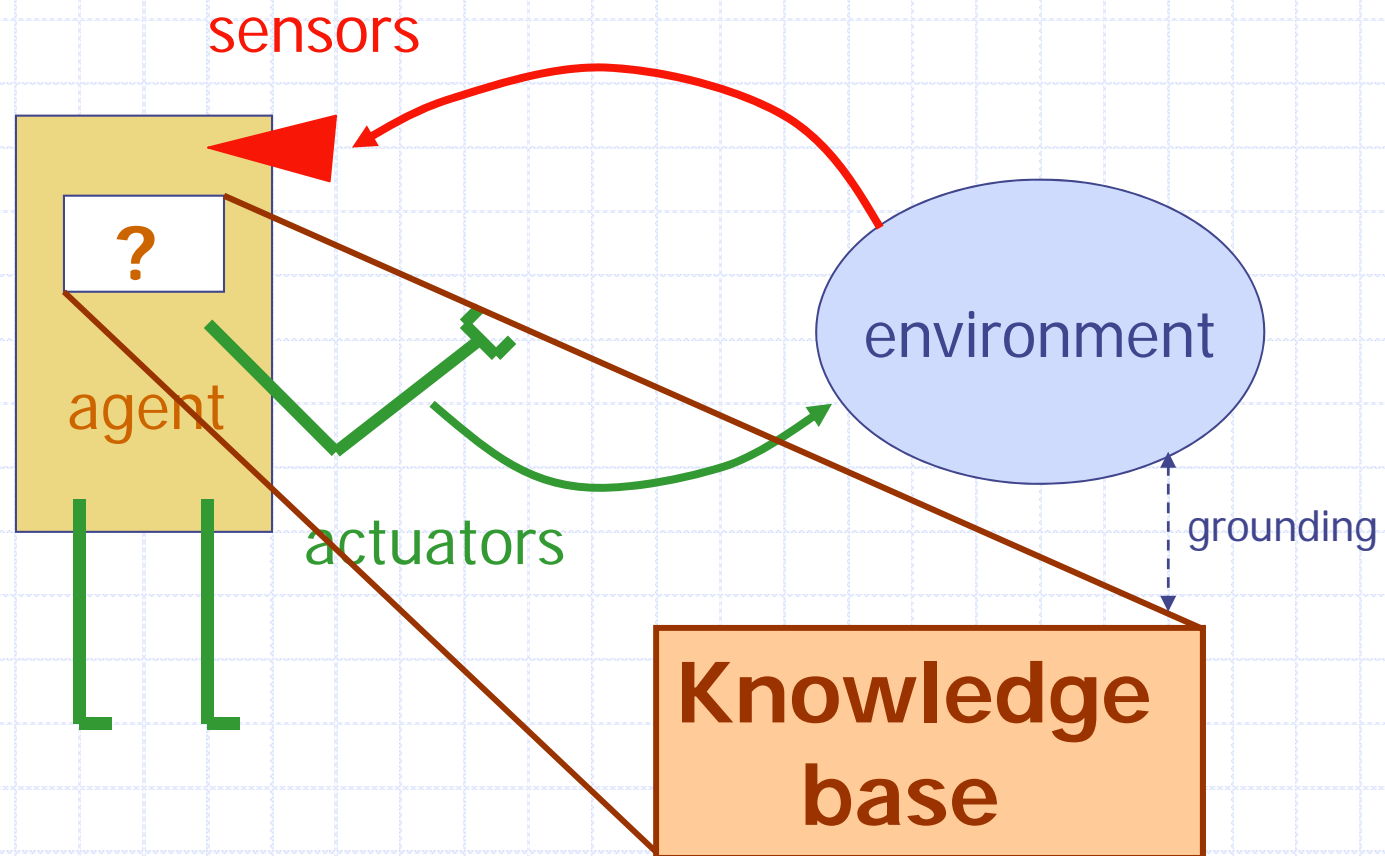
Types of Agents

- ◆ Reflex Agent
 - ◆ Dumb luck
- ◆ Problem-solving Agent
 - ◆ Specific and inflexible
- ◆ Knowledge-based agent
 - ◆ General and flexible

Partially Seen Environments

- ◆ Knowledge-based Agents can combine
 - ◆ General Knowledge
 - ◆ Current PerceptsTo infer **hidden** aspects!

Knowledge-Based Agent



Types of Knowledge

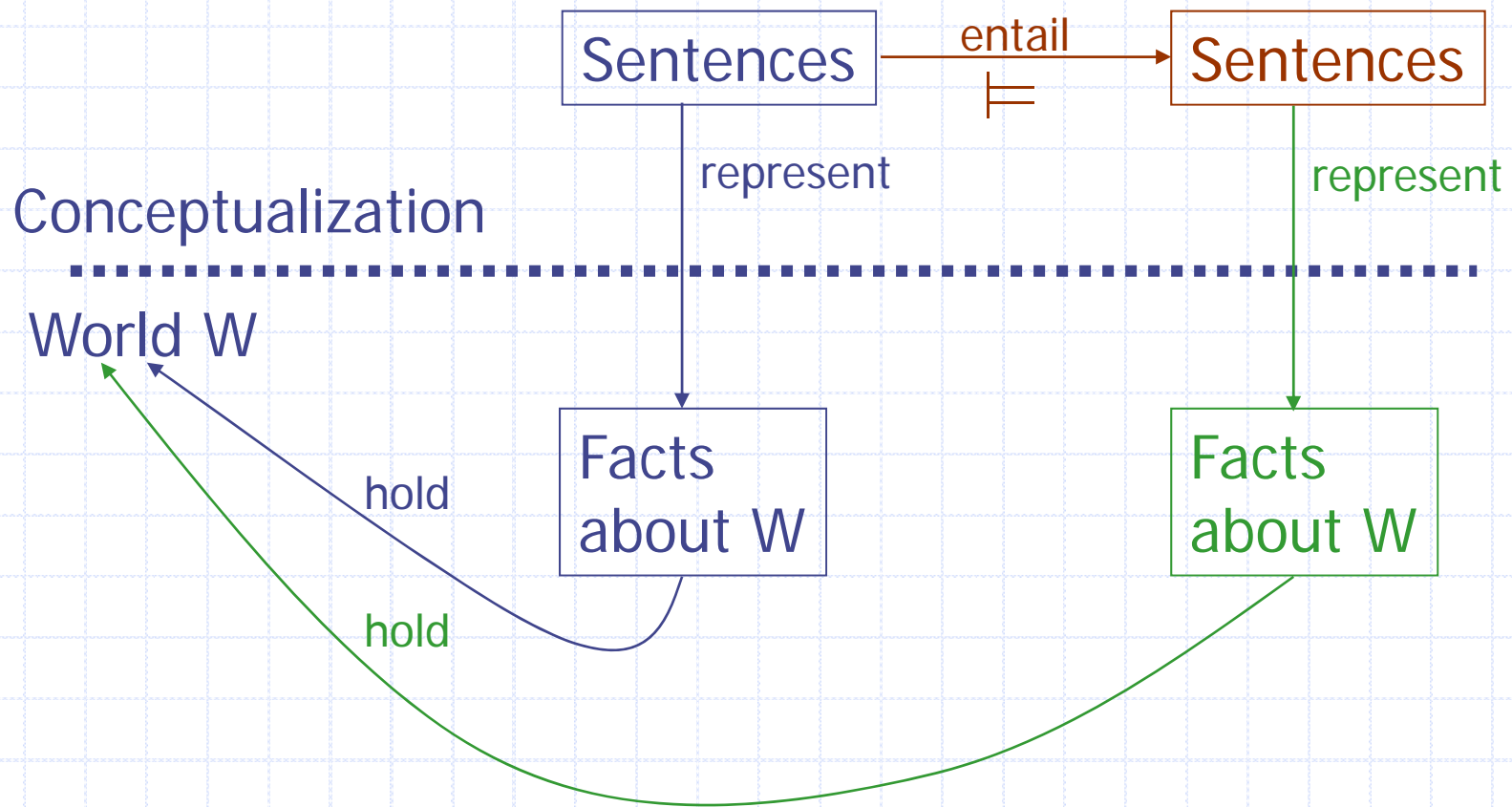
- ◆ Procedural, e.g.: functions
Such knowledge can only be used in one way -- by executing it
- ◆ Declarative, e.g.: constraints
It can be used to perform many different sorts of inferences

Logic

Logic is a **declarative** language to:

- ◆ Assert sentences representing **facts** that hold in a world **W**
(these sentences are given the value **true**)
- ◆ Deduce the **true/false** values to sentences representing **other aspects** of **W**

World-Representation



Examples of Logics

◆ Propositional calculus 

$$A \wedge B \Rightarrow C$$

◆ First-order predicate calculus

$$(\forall x) (\exists y) \text{Mother}(y, x)$$

◆ Logic of Belief

$$B(\text{John}, \text{Father}(\text{Zeus}, \text{Cronus}))$$

Symbols of PL

- ◆ Connectives: $\neg, \wedge, \vee, \Rightarrow, \Leftrightarrow$
- ◆ Propositional symbols:
 - Can be either true or false: P, Q, R, \dots
 - Fixed meaning: *True, False*

Syntax of PL

- ◆ sentence \rightarrow atomic sentence | complex sentence
- ◆ atomic sentence \rightarrow *True* | *False* | P | Q | R | ...
- ◆ complex sentence \rightarrow \neg sentence
 - | (sentence \wedge sentence)
 - | (sentence \vee sentence)
 - | (sentence \Rightarrow sentence)
 - | (sentence \Leftrightarrow sentence)

Syntax of PL

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- ◆ atomic sentence \rightarrow *True* | *False* | P | Q | R | ...
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| (sentence \wedge sentence)
| (sentence \vee sentence)
| (sentence \Rightarrow sentence)
| (sentence \Leftrightarrow sentence)

◆ Examples:

- ◆ $((P \wedge Q) \Rightarrow R)$
- ◆ $(A \Rightarrow B) \vee (\neg C)$

Counter examples:

- $(A \wedge \Rightarrow R)$
- $(A B) \vee (\neg C)$

Order of Precedence

◆ $\neg \wedge \vee \Rightarrow \Leftrightarrow$

◆ Examples:

- ◆ $\neg A \vee B \Rightarrow C$ is equivalent to $((\neg A) \vee B) \Rightarrow C$
- ◆ $A \Rightarrow B \Rightarrow C$ is incorrect

$$(A \Rightarrow B) \Rightarrow C$$

$$A \Rightarrow (B \Rightarrow C)$$

Model

- ◆ Assignment of a truth value – *true* or *false* – to every atomic sentence
- ◆ Examples:
 - ◆ Let A, B, C, and D be the propositional symbols
 - ◆ $m = \{A=\text{true}, B=\text{false}, C=\text{false}, D=\text{true}\}$ is a model
 - ◆ $m' = \{A=\text{true}, B=\text{false}, C=\text{false}\}$ is not a model
- ◆ With n propositional symbols, one can define 2^n models

What Worlds Does a Model Represent?

A model represents any world in which some fact represented by a proposition *A* having the value *True* holds and some fact represented by a proposition *B* having the value *False* does not hold (where only *A* and *B* are symbols)

$m = \{A = \textit{True}, B = \textit{False}\} \rightarrow$

Any world where *A* represents a held fact and *B* represents a fact that doesn't hold

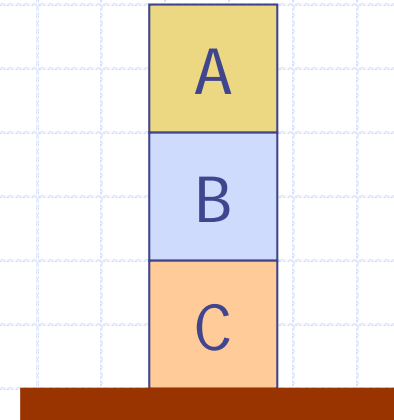
A model represents infinitely many worlds

Compare!

prop.symb.

- ◆ BLOCK(A), BLOCK(B), BLOCK(C)
- ◆ ON(A,B), ON(B,C), ONTABLE(C)
- ◆ $ON(A,B) \wedge ON(B,C) \Rightarrow ABOVE(A,C)$
- ABOVE(A,C)

- ◆ HUMAN(A), HUMAN(B), HUMAN(C)
- ◆ CHILD(A,B), CHILD(B,C), BLOND(C)
- ◆ $CHILD(A,B) \wedge CHILD(B,C) \Rightarrow GRAND-CHILD(A,C)$
- GRAND-CHILD(A,C)



Semantics of PL

- ◆ It specifies how to determine the truth value of any sentence in a model m
- ◆ The truth value of *True* is *True*
- ◆ The truth value of *False* is *False*
- ◆ The truth value of each atomic sentence is given by m
- ◆ The truth value of every other sentence is obtained recursively by using **truth tables**

Truth Tables

A	B	$\neg A$	$A \wedge B$	$A \vee B$	$A \Rightarrow B$
<i>True</i>	<i>True</i>	<i>False</i>	<i>True</i>	<i>True</i>	<i>True</i>
<i>True</i>	<i>False</i>	<i>False</i>	<i>False</i>	<i>True</i>	<i>False</i>
<i>False</i>	<i>False</i>	<i>True</i>	<i>False</i>	<i>False</i>	<i>True</i>
<i>False</i>	<i>True</i>	<i>True</i>	<i>False</i>	<i>True</i>	<i>True</i>

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<i>True</i>	<i>False</i>	<i>False</i>	<i>False</i>	<i>True</i>	<i>False</i>
<i>False</i>	<i>False</i>	<i>True</i>	<i>False</i>	<i>False</i>	<i>True</i>
<i>False</i>	<i>True</i>	<i>True</i>	<i>False</i>	<i>True</i>	<i>True</i>

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<i>True</i>	<i>False</i>	<i>False</i>	<i>False</i>	<i>True</i>	<i>False</i>
<i>False</i>	<i>False</i>	<i>True</i>	<i>False</i>	<i>False</i>	<i>True</i>
<i>False</i>	<i>True</i>	<i>True</i>	<i>False</i>	<i>True</i>	<i>True</i>

About \Rightarrow

◆ $ODD(5) \Rightarrow CAPITAL(\text{Japan, Tokyo})$

◆ $EVEN(5) \Rightarrow SMART(\text{Sam})$

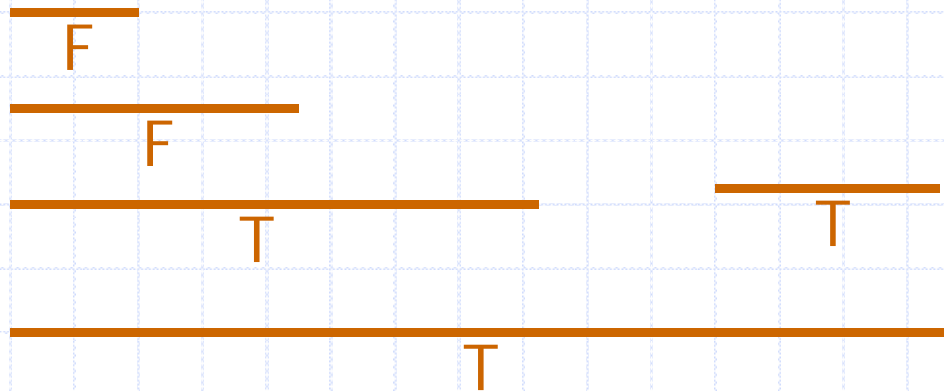
◆ Read $A \Rightarrow B$ as:

“If A IS *True*, then I claim that B is *True*, otherwise I make no claim.”

Example

Model: $A = \text{True}$, $B = \text{False}$, $C = \text{False}$, $D = \text{True}$

$$(\neg A \vee B \Rightarrow C) \Rightarrow D \wedge A$$



Definition: If a sentence s is true in a model m , then m is said to be a **model** of s

A Small Knowledge Base

1. Battery-OK \wedge Bulbs-OK \Rightarrow Headlights-Work
2. Battery-OK \wedge Starter-OK \wedge \neg Empty-Gas-Tank \Rightarrow
Engine-Starts
3. Engine-Starts \wedge \neg Flat-Tire \Rightarrow Car-OK
4. Headlights-Work
5. \neg Car-OK

Sentences 1, 2, and 3 \rightarrow Background knowledge

Sentences 4 and 5 \rightarrow Observed knowledge

Model of a KB

- ◆ Let **KB** be a set of sentences
- ◆ A model **m** is a model of **KB** iff it is a model of all sentences in **KB**, that is, all sentences in **KB** are true in **m**

Satisfiability of a KB

A KB is **satisfiable** iff it admits at least one model; otherwise it is **unsatisfiable**

KB1 = $\{P, \neg Q \wedge R\}$ is satisfiable

KB2 = $\{\neg P \vee P\}$ is satisfiable

KB3 = $\{P, \neg P\}$ is unsatisfiable

valid sentence
or tautology

Logical Entailment

- ◆ KB : set of sentences
- ◆ α : arbitrary sentence
- ◆ KB **entails** α – written $KB \models \alpha$ – iff every model of KB is also a model of α

Logical Entailment

- ◆ KB : set of sentences
- ◆ α : arbitrary sentence
- ◆ KB **entails** α – written $KB \models \alpha$ – iff every model of KB is also a model of α
- ◆ Alternatively, $KB \models \alpha$ iff
 - ◆ $\{KB, \neg\alpha\}$ is unsatisfiable
 - ◆ $KB \Rightarrow \alpha$ is valid

Logical Equivalence

- ◆ Two sentences α and β are logically **equivalent** – written $\alpha \equiv \beta$ -- iff they have the same models, i.e.:

$$\alpha \equiv \beta \text{ iff } \alpha \models \beta \text{ and } \beta \models \alpha$$

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- ◆ Examples:

- ◆ $(\alpha \wedge \beta) \equiv (\beta \wedge \alpha)$

- ◆ $\alpha \Rightarrow \beta \equiv \neg\alpha \vee \beta$

- ◆ $\neg(\alpha \wedge \beta) \equiv \neg\alpha \vee \neg\beta$

- ◆ $\neg(\alpha \vee \beta) \equiv \neg\alpha \wedge \neg\beta$

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- ◆ $\neg(\alpha \wedge \beta) \equiv \neg\alpha \vee \neg\beta$

- ◆ $\neg(\alpha \vee \beta) \equiv \neg\alpha \wedge \neg\beta$

- ◆ One can always replace a sentence by an equivalent one in a KB

Inference Rule

- ◆ An inference rule $\{\xi, \psi\} \vdash \phi$ consists of 2 sentence patterns ξ and ψ called the **conditions** and one sentence pattern ϕ called the **conclusion**

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- ◆ An inference rule $\{\xi, \psi\} \vdash \phi$ consists of 2 sentence patterns ξ and ψ called the conditions and one sentence pattern ϕ called the conclusion
- ◆ If ξ and ψ match two sentences of KB then the corresponding ϕ can be inferred according to the rule

Example: Modus Ponens

$$\{ \alpha \Rightarrow \beta, \alpha \} \vdash \beta$$
$$\{ \xi, \psi \} \vdash \varphi$$

The diagram illustrates the application of the Modus Ponens rule. It shows two logical expressions. The top expression is $\{ \alpha \Rightarrow \beta, \alpha \} \vdash \beta$, where $\alpha \Rightarrow \beta$ is in red, α is in green, and β is in blue. The bottom expression is $\{ \xi, \psi \} \vdash \varphi$, where ξ is in red, ψ is in green, and φ is in blue. Three arrows indicate the substitution: a red arrow from ξ to α , a green arrow from ψ to α , and a blue arrow from φ to β .

Example: Modus Ponens

$$\{ \alpha \Rightarrow \beta, \alpha \} \vdash \beta$$

$\{ \xi, \psi \} \vdash \varphi$

Battery-OK \wedge Bulbs-OK \Rightarrow Headlights-Work

Battery-OK \wedge Starter-OK \wedge \neg Empty-Gas-Tank \Rightarrow Engine-Starts

Engine-Starts \wedge \neg Flat-Tire \Rightarrow Car-OK

Battery-OK \wedge Bulbs-OK

Example: Modus Ponens

$$\{ \alpha \Rightarrow \beta, \alpha \} \vdash \beta$$

The diagram illustrates the Modus Ponens rule. It shows a set of premises $\{ \alpha \Rightarrow \beta, \alpha \}$ on the left, followed by a turnstile symbol \vdash , and the conclusion β on the right. Below this, a smaller set of premises $\{ \xi, \psi \}$ is shown, followed by a turnstile symbol \vdash , and the conclusion ϕ on the right. A red arrow points from ξ to α in the upper set, and a green arrow points from ψ to β in the upper set. A blue arrow points from ϕ to β in the upper set, indicating that ϕ is substituted for α in the implication.

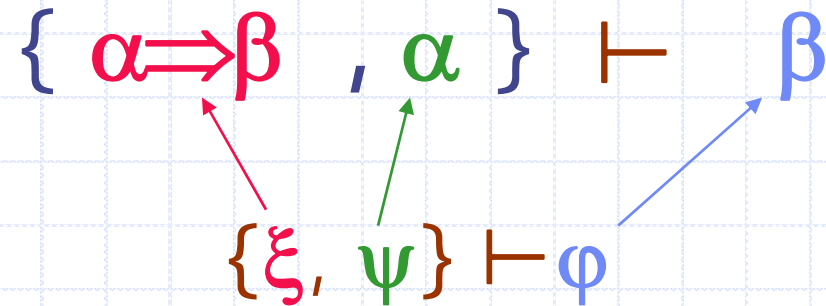
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$\text{Battery-OK} \wedge \text{Bulbs-OK}$

Example: Modus Ponens



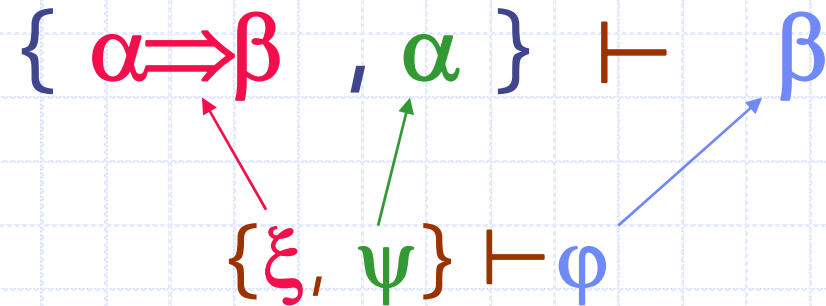
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$\text{Battery-OK} \wedge \text{Bulbs-OK}$

Example: Modus Ponens



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$\text{Battery-OK} \wedge \text{Bulbs-OK}$

Headlights-Work

Example: Modus Tolens

$$\{ \alpha \Rightarrow \beta, \neg \beta \} \vdash \neg \alpha$$

Engine-Starts \wedge \neg Flat-Tire \Rightarrow Car-OK
 \neg Car-OK

Example: Modus Tolens

$$\{ \alpha \Rightarrow \beta, \neg \beta \} \vdash \neg \alpha$$

Engine-Starts \wedge \neg Flat-Tire \Rightarrow Car-OK
 \neg Car-OK
 \neg (Engine-Starts \wedge \neg Flat-Tire)

Example: Modus Tolens

$$\{ \alpha \Rightarrow \beta, \neg \beta \} \vdash \neg \alpha$$

Engine-Starts \wedge \neg Flat-Tire \Rightarrow Car-OK

\neg Car-OK

\neg (Engine-Starts \wedge \neg Flat-Tire) \equiv \neg Engine-Starts \vee Flat-Tire

Other Examples

◆ $\{\alpha, \beta\} \vdash \alpha \wedge \beta$

◆ $\{\alpha \wedge \beta, \dots\} \vdash \alpha$

◆ $\{\alpha \wedge \beta, \dots\} \vdash \beta$

◆ Etc ...

Inference

- ◆ I: Set of inference rules
- ◆ KB: Set of sentences
- ◆ **Inference** is the process of applying successive inference rules from I to KB, each rule adding its conclusion to KB

Example

1. $\text{Battery-OK} \wedge \text{Bulbs-OK} \Rightarrow \text{Headlights-Work}$
2. $\text{Battery-OK} \wedge \text{Starter-OK} \wedge \neg \text{Empty-Gas-Tank} \Rightarrow \text{Engine-Starts}$
3. $\text{Engine-Starts} \wedge \neg \text{Flat-Tire} \Rightarrow \text{Car-OK}$
4. Headlights-Work
5. Battery-OK
6. Starter-OK
7. $\neg \text{Empty-Gas-Tank}$
8. $\neg \text{Car-OK}$

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6. Starter-OK
7. $\neg \text{Empty-Gas-Tank}$
8. $\neg \text{Car-OK}$
9. $\text{Battery-OK} \wedge \text{Starter-OK} \leftarrow (5+6)$

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10. Battery-OK \wedge Starter-OK \wedge \neg Empty-Gas-Tank $\leftarrow (9+7)$

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11. Engine-Starts $\leftarrow (2+10)$

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12. \neg Engine-Starts \vee Flat-Tire \leftarrow (3+8)

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11. $\text{Engine-Starts} \quad \leftarrow (2+10)$
12. $\neg \text{Engine-Starts} \vee \text{Flat-Tire} \quad \leftarrow (3+8) \quad \equiv \quad \text{Engine-Starts} \Rightarrow \text{Flat-Tire}$

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11. $\text{Engine-Starts} \quad \leftarrow (2+10)$
12. $\text{Engine-Starts} \Rightarrow \text{Flat-Tire} \quad \leftarrow (3+8)$
13. $\text{Flat-Tire} \quad \leftarrow (11+12)$

Soundness

- ◆ An inference rule is **sound** if it generates only entailed sentences

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- ◆ All inference rules previously given are sound, e.g.:
modus ponens: $\{\alpha \Rightarrow \beta, \alpha\} \vdash \beta$
- ◆ The following rule:
 $\{\alpha \vee \beta, .\} \vdash \neg \alpha \vee \neg \beta$
...is unsound

Completeness

- ◆ A set of inference rules is **complete** if every entailed sentences can be obtained by applying some finite succession of these rules
- ◆ Modus ponens alone is not complete, e.g.:
from $A \Rightarrow B$ and $\neg B$, we cannot get $\neg A$
(needed Modus Tolens for that)

Proof

The **proof** of a sentence α from a set of sentences KB is the derivation of α by applying a series of sound inference rules

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12. Engine-Starts \Rightarrow Flat-Tire \leftarrow (3+8)
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\Rightarrow Connective symbol (implication)

\models Logical entailment

$KB \models \alpha$ iff $KB \Rightarrow \alpha$ is valid

\vdash Inference

$\vdash \sim \models$ if \vdash sound and complete

Summary

- ◆ Knowledge representation
- ◆ Propositional Logic
- ◆ Truth tables
- ◆ Model of a KB
- ◆ Satisfiability of a KB
- ◆ Logical entailment
- ◆ Inference rules
- ◆ Proof