

## Artificial Intelligence

### Module 4: Logic and Deduction

#### PART 4.1: Knowledge Representation PART 4.2: Propositional logic

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(Slides adapted from StuartJ. Russell, B Ravindran, Mausam, Dan Klein and Pieter Abbeel, Fartha P Chakrabarti, Saikishor Jangiti)

## Module 4: Logic and Deduction

- PART 4.1 : Logical Agents
- PART 4.2 : Propositional logic
- PART 4.3 : Predicate Logic
  - Propositional Logic to Predicate Logic
  - Predicate Logic Fundamentals
- PART 4.4 : Deduction & Reasoning Tasks
- PART 4.5 : Inference By Forward & Backward Chaining
  - Representing knowledge using Prolog
- PART 4.6 : Inferencing By Resolution Refutation
- PART 4.7: Reduction to satisfiability problem : SAT Solver

## AI Problem Areas /Tasks

- |  |  |   |
|--|--|---|
| <ul style="list-style-type: none"> <li>• <b>1<sup>st</sup> Generation of AI :</b><br/>Fomal cognitive Tasks</li> <li>– Game                             <ul style="list-style-type: none"> <li>• Tic-Tac-Toe</li> <li>• Chess</li> <li>• Checkers</li> <li>• Go</li> </ul> </li> <li>– Mathematics                             <ul style="list-style-type: none"> <li>• Logic</li> <li>• Geometry</li> <li>• Calculus</li> <li>• Proving properties of programs</li> </ul> </li> </ul> | <ul style="list-style-type: none"> <li>• <b>2<sup>nd</sup> Generation : Expert Tasks</b></li> <li>– Knowledge Representation</li> <li>– Enginerring                             <ul style="list-style-type: none"> <li>• Design</li> <li>• fault finding</li> <li>• Manufacturing planning</li> </ul> </li> <li>– Medical                             <ul style="list-style-type: none"> <li>• Diagnosis</li> <li>• Medical Image Analysis</li> </ul> </li> <li>– Finanical                             <ul style="list-style-type: none"> <li>• Stock market prdeictions</li> </ul> </li> </ul> | <ul style="list-style-type: none"> <li>• <b>3<sup>rd</sup> Generation of AI :</b><br/>Perceptual Tasks</li> <li>– Perception                             <ul style="list-style-type: none"> <li>• Vision</li> <li>• Speech</li> </ul> </li> <li>– Natual Language                             <ul style="list-style-type: none"> <li>• Understanding</li> <li>• Generation</li> <li>• Translation</li> </ul> </li> <li>– Robot Control</li> </ul> |
|--|--|---|

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## Exercise : Identify the Product



## Logical Agent

- **Knowledge** can be defined as the body of facts and principles accumulated by human-kind or the act, fact or state of knowing.
- includes having a familiarity with
  - language, concepts,
  - procedures, rules,
  - ideas, abstractions ,
  - places, customs,
  - facts associations
  - ability to use these notions effectively in modeling different aspects of the world.

```

Welcome to          EEEEE LL   IIII ZZZZZ AAAAA
                   EE   LL   II   ZZ   AA   AA
                   EEEEE LL   II   ZZ   AAAAAA
                   EE   LL   II   ZZ   AA   AA
                   EEEEE LLLLL IIII ZZZZZZ AA   AA

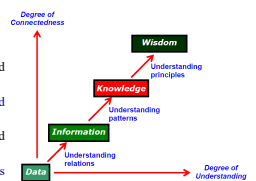
ELIZA is a rock Republican psychotherapist.
The original program was described by Joseph Weizenbaum in 1966.
This implementation by Norbert Lorsteiner, 2005.

ELIZA: Is something troubling you ?
YOU:  Men are all alike.
ELIZA: What is the connection, do you suppose ?
YOU:  They're always bugging us about something or other.
ELIZA: Can you think of a specific example ?
YOU:  Well, my boyfriend made me come here.
ELIZA: Is it important to you that your boyfriend made you come here ?
YOU:  He says I'm depressed much of the time.
ELIZA: I am sorry to hear that you are depressed.
YOU:  It's true, I am unhappy.
ELIZA: Can you explain what made you unhappy ?
YOU:
    
```

- ✓ Represent the **knowledge** in state-space
- ✓ Reason about the **solution** in logical steps

## Knowledge Model

- **Facts**
- **Data** is viewed as collection of disconnected facts.
  - Example : It is raining.
- **Information** emerges when relationships among facts are established and understood; Provides answers to "who", "what", "where", and "when".
  - Example : The temperature dropped 15 degrees and then it started raining.
- **Knowledge** emerges when relationships among patterns are identified and understood; Provides answers as "how".
  - Example : If the humidity is very high and the temperature drops substantially, then atmospheris is unlikely to hold the moisture, so it rains.
- **Wisdom** is the pinnacle of understanding, uncovers the principles of relationships that describe patterns. Provides answers as "why"
  - Example : Encompasses understanding of all the interactions that happen between raining, evaporation, air currents, temperature gradients, changes, and raining.



- Don't confuse **Knowledge** with data.
- **Epistemology** – study of nature of knowledge.
- **Metaknowledge** – knowledge about knowledge.

## State-space representation

- In Search Strategies, the states are represented as
  - Atomic representation
  - Treated as black box
  - Many factors are ignored, e.g., gas in car, money available for toll, etc.
- To include more factors in our state representation, we have
  - Factored Representation**
  - Each state will be represented with
    - Factors
    - Each factor can be a **Boolean or real-valued variable**
    - E.g., City Arad can now be represented as
    - {“lat”: 46.1866, “lon”: 21.3123, “has\_gas\_till\_next\_station”: yes}

## Factored Representation


- Why do we need Factored representation
  - To reason about steps
  - To learn new knowledge about the environment
  - To adapt to changes to the existing knowledge
  - Accept new tasks in the form of explicit goals
  - To overcome partial observability of environment
- E.g., Arad to Bucharest via Sibiu
- If Sibiu has road blocked, then the agent should take a different path
- i.e., to build **Knowledge-based Agents**

## Knowledge-based Agents

- Solving problems by**
  - Representing the knowledge in state-space
  - Reasoning about the solution in logical steps
- Central Component:**
  - Knowledge Base (KB)**
    - set of sentences, not the English sentences.,
  - Represents some assertion about the world
- Sentence**
  - representation of knowledge in a language called **Knowledge representation language**
  - Represents an **axiom**, when the sentence is taken as given without being derived from other sentences
    - TELL** operation: Add new sentences to the knowledge base
    - ASK** operation: Query what is known

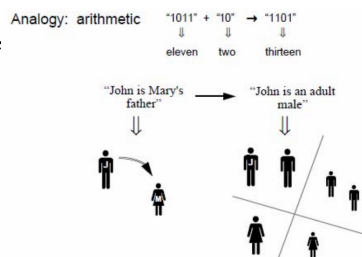


## What is representation

- Symbols standing for things in the world
  - 
- Knowledge representation :**
  - symbolic encoding of preposition beloved ( by some agent )

## What is reasoning

- Manipulation of symbols encoding propositions to produce representations of new propositions
- Benefits of Reasoning
  - Given
    - Patient X allergic to medication M
    - Anyone allergic to medication M is also allergic to medication M'
  - Reasoning helps us derive
    - Patient X is allergic to medication M'

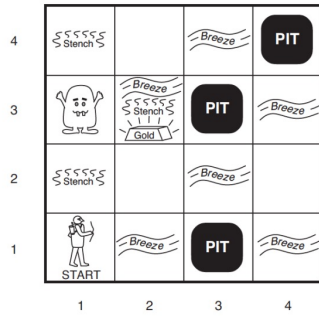


## Knowledge-based Agents

- Each time a knowledge-based agent is called, it does three things
  - TELL** – the Knowledge Base about the percepts (inputs)
  - ASK** – the Knowledge Base what action it should perform.
    - Extensive reasoning about the outcomes of possible action and current state
  - TELL** – the Knowledge Base about selected action (to update) and agent executes the action
- The agent must
  - Represent states and actions
  - Incorporate new percepts
  - Update internal representations of the world
  - Deduce hidden properties of the world
  - Deduce appropriate actions

## Example: Knowledge-based Agents

- Wumpus World



## Knowledge-based Agents: Wumpus World PEAS description

- Performance measure
    - gold +1000, death -1000
    - 1 per step, -10 for using the arrow
  - Environment
    - Squares adjacent to **wumpus** are **smelly**
    - Squares adjacent to **pit** are **breezy**
    - Glitter** iff **gold** is in the same square
    - Shooting** kills wumpus if you are **facing** it
    - Shooting** uses up the only **arrow**
    - Grabbing** picks up **gold** if in same square
    - Releasing** drops the **gold** in same square
  - Sensors: Stench, Breeze, Glitter, Bump, Scream
  - Actuators: Left turn, Right turn, Forward, Grab, Release, Shoot
- Wumpus world characterization**
- Fully Observable
    - No - only local perception
  - Deterministic
    - Yes - outcomes exactly specified
  - Episodic
    - No - sequential at the level of actions
  - Static
    - Yes - Wumpus and Pits do not move
  - Discrete
    - Yes
  - Single-agent?
    - Yes - Wumpus is essentially a natural feature

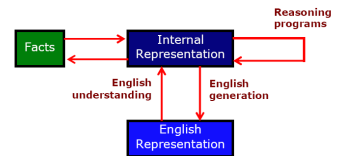
## Exploring a Wumpus World



How do we represent rules of the world and the percepts encountered

## Knowledge Representation (KR)

- Knowledge** is a description of the world;
- Knowledge can be of the following types
  - Declarative (statements)
  - Procedural (facts)
  - Heuristics (rule of thumb / experience)
- Representation** is the way **knowledge** is **encoded**
- Represent** knowledge about the world in a manner that **facilitates inferencing**
  - (drawing conclusions) from knowledge.
- Example: Arithmetic logic
  - $x \geq 5$
  - i.e.  $x=7$  is a model of world
- In AI: typically based on
  - Logic
  - Probability
  - Logic and Probability



## Components of KR

- Syntax:
  - defines the sentences in the language
- Semantics:
  - defines the "meaning" to sentences
- Inference Procedure
  - Algorithm
  - Sound?
  - Complete?
  - Complexity
- Knowledge Base
  - Set of facts associated with a particular problem or situation

## Knowledge bases

- Two main components**
  - Knowledge base** = set of **sentences** in a **formal language**
    - Represents some assertion about the world
  - Inference Engine**
    - Mechanism to derive new sentences from old
    - Declarative approach to building an agent (or other system):
      - Tell it what it needs to know
      - Then it can **Ask** itself what to do - answers should follow from the KB
    - Both "Tell" and "Ask" involve inference - deriving new sentences from old
- Agents can be viewed at the **knowledge level**
  - i.e., what they know, regardless of how implemented
- Or at the **implementation level**
  - i.e., data structures in KB and algorithms that manipulate them



## Logical Representation

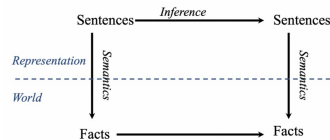
- **Logic** - formal languages for representing information such that conclusions can be drawn
- **Sentence** – individual piece of knowledge
- Logic includes : Syntax , Semantics and Inference Procedure.
- **Syntax** – What expressions are legal?
  - In the language of arithmetic  $x+2 \geq y$  is a sentence (well-formed sentence) , but  $x2+ y \geq$  is not a sentence
- **Semantics** – What the legal expressions mean?
  - $x + 2 \geq y$  is true iff the number  $x + 2$  is no less than the number  $y$
  - $x + 2 \geq y$  is true in a world where  $x= 5, y= 4$
  - $x + 2 \geq y$  is false in a world where  $x= 3, y= 7$
- **Inference Procedure** :
  - Specifies methods for computing new sentences from an existing sentences.

## Logic

- Reasoning conducted or assessed according to available knowledge about the domain
- **Syntax**: Every sentence in our knowledge base are expressed according to a syntax of the representing language.
  - E.g., in Arithmetic,
  - “ $x + y = 4$ ” is a well-formed sentence, “ $xy+4=$ ” is not
- Atoms
  - $P, Q, R, \dots$
- Literals
  - $P, \neg P$
- Sentences
  - Any literal is a sentence
  - If  $S$  is a sentence
    - Then  $(S \wedge S)$  is a sentence
    - Then  $(S \vee S)$  is a sentence
- Conveniences
  - $P \rightarrow Q$  same as  $\neg P \vee Q$

## Logic: World to Representation

- **Syntax**: which arrangements of symbols are legal
  - (Def “sentences”)
- **Semantics**: what the symbols mean in the world
  - (Mapping between symbols and worlds)
  - Meaning of sentence.
  - They define the truth of a sentence according to a possible world.
  - E.g., in a world where  $x=2, y=2$ , “ $x + y = 4$ ” is a true sentence, whereas in a world where  $x=1, y=1$ , the same sentence is not true
  - In standard Logic, every sentence has to be either True or False but cannot be in between

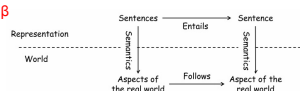


## Logic – Model

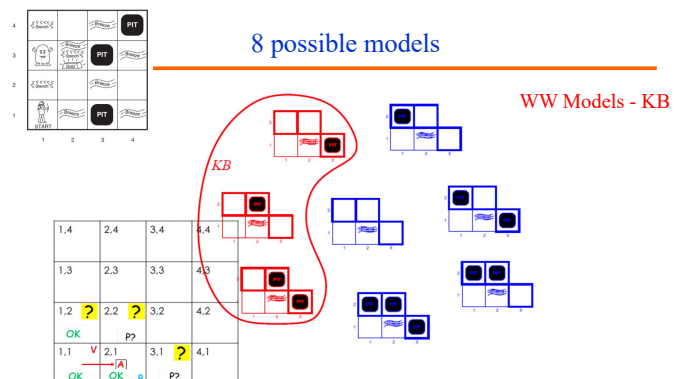
- Formally structured worlds with respect to which truth can be evaluated
- Model is **Any possible world**. Not necessarily the reality. Any combination of assignment of truth values to sentences in our KB.
- Models are **mathematical abstractions**
  - We say  $m$  is a model of a sentence  $\alpha$  if  $\alpha$  is true in  $m$
  - $M(\alpha)$  is the set of all models of  $\alpha$
  - Example:  $x+2 \geq y$  is true in a world
    - where  $x = 5, y = 4$
    - where  $x = 4, y = 4$
- E.g., Two sentences  $S1$  and  $S2$  in our KB.
- Possible models:
  - $m1: \{S1: True, S2: True\}, m2: \{S1: False, S2: True\}, m3: \{S1: True, S2: False\}, m4: \{S1: False, S2: False\}$
- $S1$  is true in  $m1, m3 \rightarrow$  i.e.  $m1$  satisfies  $S1$  or  $m3$  satisfies  $S1$
- $M(S1)$  is set of models that satisfy  $S1$ , i.e.,  $\{m1, m3\}$

## Logic – Entailment

- Means that one thing follows from another:  $KB \models \alpha$
- Knowledge Base  $KB$  entails a sentence  $\alpha$  iff  $\alpha$  is true in all worlds where  $KB$  is true
- Relationship between sentences that is based on semantics
- Logical Reasoning: Logical entailment between sentences
  - i.e., a sentence follows from another sentence
  - $\alpha \models \beta$ , it means that sentence  $\alpha$  entails the sentence  $\beta$
  - In every model where  $\alpha$  is true,  $\beta$  is also true
  - $\alpha \models \beta$  if and only if  $M(\alpha) \subseteq M(\beta)$
- **Example**:
  - In Wumpus World, the agent is in  $[2,1]$  and detected a breeze
  - The agent is interested in squares  $[1, 2], [2, 2], [3, 1]$  for next move.
  - Now, each square might or might not contain a pit (total  $2^3 = 8$  possible models)
  - Our KB tells us that in  $[1, 1]$  we didn't receive a breeze and hence  $[2, 1]$  doesn't have a pit

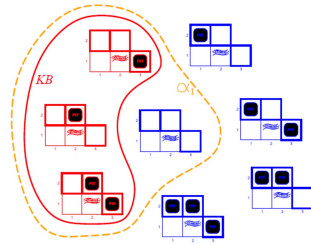


## 8 possible models



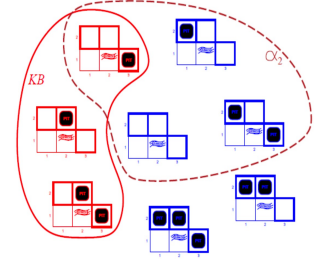
## Entailment by model checking

- Define  $\alpha_1 =$  "There is no pit in [1, 2]"
- In every model, where KB is true,  $\alpha_1$  is also true
- $\alpha_1 =$  "[1, 2] is safe"
- Hence,  $KB \models \alpha_1$
- $M(KB) \subseteq M(\alpha_1)$
- **Model Checking:** This enumeration of all models to verify logical inference (entailment) is called **Model Checking**



## Logic – WW models - Entailment

- Define  $\alpha_2 =$  "There is no pit in [2, 2]"
- Here,  $\alpha_2$  is true in models where KB is not true
- Hence,  $KB \not\models \alpha_2$



## Logic – Entailment

- **Sound**
  - An inference algorithm that derives only entailed sentences
  - E.g., Model Checking is a sound inference procedure
- **Completeness**
  - An inference algorithm is complete if it can derive any sentence that is entailed
- If KB is true, any sentence derived using Sound inference procedure is also true in real world.
- Eg:
  - KB:
    - Learning is maximum in fun classes
    - AI class is a fun class
  - Entails : ??
    - Learning is maximum in AI class

## Logic - Grounding

- Grounding
  - connection between logical reasoning and real environment in which agent exists
- How do we know that KB is true in the real world?
- Agent's sensors create the connection
- Agent creates sentence from percept (e.g., smell in wumpus world)
- This sentence when stored in Knowledge base will be true in real world
- However, the existing Knowledge Base's sentences like "Wumpus cause smell in adjacent squares" is not a direct representation of single percept but is a general rule.
- Such rules can be **learned**.

## Logic in Ancient Times

**Indic**  
 Geometry, Calculations  
 Nyaya, Vaisisekha  
 Theory of Argumentation (शास्त्रार्थ)  
 Sanskrit language with Binary-Level arguments  
 Logical Argumentation: Chatustoki  
 Buddhist and Jain Philosophies  
 Formal Systems  
 Vedanta



**China**  
 Confucious, Mozi,  
 Master Mo (Mohist School)  
 Basic Formal Systems  
 Buddhist Systems from India

## Logic in Ancient Times

**Indic**  
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 Formal Systems  
 Vedanta

**Greek**  
 Thales, Pythagoras (Propositions and Geometry)  
 Heraclitus, Parmenides (Logos)  
 Plato (Logic beyond Geometry)  
 Aristotle (Syllogism, Syntax)  
 Stoics

**Today**  
 Propositional  
 Predicate  
 Higher Order  
 Logic, Numbers &  
 Computation  
 Psychology  
 Philosophy  
 Brain/ Neural Network

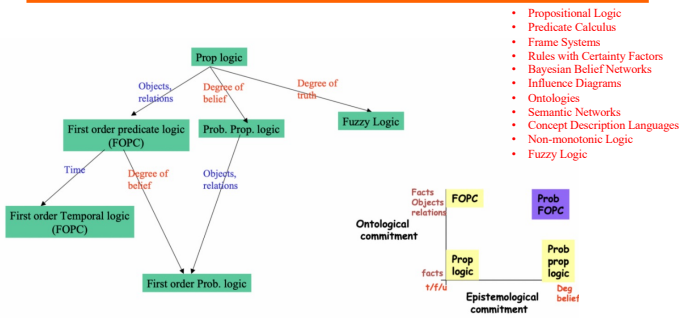
**Middle East**  
 Ancient Egypt, Babylon  
 Arab (Avisennian Logic)  
 Inductive Logic

**China**  
 Confucious, Mozi,  
 Master Mo (Mohist School)  
 Basic Formal Systems  
 Buddhist Systems from India

**Medieval Europe**  
 Post Aristotle  
 Precursor to First Order Logic



## Common KR Languages in AI



## Logic

- **Assumptions about Knowledge Representation (KR) :**
  - Intelligent Behaviour can be achieved by manipulation languages of symbol structures.
  - KR are designed to facilitate operations over symbol structures, have precise syntax and semantics;
  - Make Inferences, draw new conclusions from existing facts.
- To satisfy these assumptions about KR, we need **formal notation** that allow automated inference and problem solving. *One popular choice is use of logic.*
- Logic is a language for reasoning, a collection of rules used while doing logical reasoning.
- Language of Logic : way of representing fact
- Logic is studied as **Knowledge Representation languages** in AI.
- Propositional logic and Predicate logic are fundamental to all logic.
  - 1) **Propositional logic** - is the study of statements and their connectivity.
    - Propositional:  $p \Rightarrow p$
  - 2) **Predicate Logic** - is the study of individuals and their properties.
    - Predicate:  $\forall x: p(x) \Rightarrow p(x)$
- They represent things and allow more or less efficient inference.

## Representing simple facts in logic

To present real world facts as logical prepositions written as **well-formed formulas (wff)**

If it is hot it will rain.

$\Rightarrow \text{hot}(X) \rightarrow \text{rain}(X)$

## Propositional Logic

- A proposition is a statement, which in English would be a declarative sentence.
- Every proposition is either **TRUE** or **FALSE**.

Examples:

- The sky is blue.
- Snow is cold.
- $12 * 12 = 144$

- Propositions are "sentences", either true or false but not both.
- A sentence is **smallest unit** in propositional logic.
- If proposition is true, then truth value is "true"
  - if proposition is false, then truth value is "false"

## PROPOSITIONAL LOGIC

- A simple representation language for building knowledge-based agents
- Proposition Symbol – A symbol that stands for a proposition.
  - E.g.,  $W_{1,3}$  – "Wumpus in [1,3]" is a proposition and  $W_{1,3}$  is the symbol
- **Syntax:**
  - Atomic sentences:  $P, Q, \dots$ 
    - Usually represented with uppercase letter and may contain other letters or subscripts. E.g.,  $P, Q, R, W_{1,3}, \text{North}$
  - Connectives:  $\sim, \neg, \wedge, \vee, \rightarrow$ 
    - Large, compound or complex statement are constructed from basic propositions by **combining them with connectives**.
- **Semantics**
  - Truth Tables : True and False
- **Inference**
  - Modus Ponens
  - Resolution

## BNF (Backus–Naur Form) grammar of sentences in propositional logic

*Connectives and Symbols in decreasing order of operation priority*

Connective	Symbols	Read as
assertion	$P$	"p is true"
negation	$\neg, \sim, !$	NOT "p is false"
conjunction	$P \wedge Q, \&\&, \&$	AND "both p and q are true"
disjunction	$P \vee Q,   ,  $	OR "either p is true, or q is true, or both"
implication	$P \rightarrow Q, \supset, \Rightarrow$	if...then "if p is true, then q is true" "p implies q"
equivalence	$\leftrightarrow, \Leftrightarrow$	if and only if "p and q are either both true or both false"

OPERATOR PRECEDENCE :  $\neg, \wedge, \vee, \Rightarrow, \Leftrightarrow$

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

## Propositional Theorem Proving

- **Theorem Proving**
  - applying rules of inference directly to sentences in our KB to prove query sentence without consulting models
- **Logical Equivalence**
  - two sentences  $\alpha$  and  $\beta$  are logically equivalent if they are true in the same set of models denoted as  $\alpha \equiv \beta$

## Propositional Theorem Proving - Logical Equivalence Laws

- Two sentences are logically equivalent iff true in same models:
- $\alpha \equiv \beta$  if and only if  $\alpha \vDash \beta$  and  $\beta \vDash \alpha$

$(\alpha \wedge \beta) \equiv (\beta \wedge \alpha)$	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
$(\alpha \Rightarrow \beta) \equiv (\neg\alpha \vee \beta)$	implication elimination
$(\alpha \Leftrightarrow \beta) \equiv ((\alpha \Rightarrow \beta) \wedge (\beta \Rightarrow \alpha))$	biconditional elimination
$\neg(\alpha \wedge \beta) \equiv (\neg\alpha \vee \neg\beta)$	De Morgan
$\neg(\alpha \vee \beta) \equiv (\neg\alpha \wedge \neg\beta)$	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 $\wedge$

## Inference Rules and Proofs

- Inference rules that can be applied to derive a **proof**
  - a chain of conclusions that leads to the desired goal.
- **Inference Rules:**
  - **Modus Ponens** (Latin for mode that affirms) and is written  $\frac{\alpha \Rightarrow \beta, \alpha}{\beta}$ 
    - if (WumpusAhead  $\wedge$  WumpusAlive)  $\Rightarrow$  Shoot and (WumpusAhead  $\wedge$  WumpusAlive) are given, then Shoot can be inferred.
  - **And-Elimination**, says that, from a conjunction, any of the conjuncts can be inferred:  $\frac{\alpha \wedge \beta}{\alpha}$ 
    - from (WumpusAhead  $\wedge$  WumpusAlive), WumpusAlive can be inferred.
  - **Resolution Technique**:
    - assumes sentences are in conjunctive normal form (**CNF**) – conjunction of clauses,
    - e.g.  $(\neg B1,1 \vee P1,2 \vee P2,1) \wedge (\neg P1,2 \vee B1,1) \wedge (\neg P2,1 \vee B1,1)$

## Proposition Examples

- If I am the Student President then I am well-known. I am the Student President. So I am well-known.
- If I am the Student President then I am well-known. I am not the Student President. So I am not well-known.
- If Rajat is the Student President then Rajat is well-known. Rajat is the Student President. So Rajat is well known.
- If Asha is elected VP then Rajat is chosen as G-Sec and Bharati is chosen as Treasurer. Rajat is not chosen as G-Sec. Therefore Asha is not elected VP.
- If Asha is elected VP then Rajat is chosen as G-Sec and Bharati is chosen as Treasurer. Rajat is chosen as G-Sec. Therefore Asha is elected VP.

## Deduction Using Propositional Logic: Steps

- **Atoms**
  - lower-case letters,  $p, q, r$ , are symbols for simple statements.
  - Choice of Boolean Variables  $a, b, c, d, \dots$ 
    - which can take values true or false.
- **Boolean Formulae developed** using well defined connectors  $\sim, \neg, \wedge, \vee, \rightarrow, \Leftrightarrow$  etc, whose meaning (semantics) is given by their truth tables.
  - $P \rightarrow Q$  same as  $\neg P \vee Q$
- **Codification** of Sentences of the argument into Boolean Formulae.
- Developing the **Deduction Process** as obtaining truth of a **Combined Formula** expressing the complete argument.
- **Determining the Truth or Validity** of the formula and thereby proving or disproving the argument and Analyzing its truth under various Interpretations.

## Deduction Using Propositional Logic: Example 1

**Atoms:** Choice of Boolean Variables  $a, b, c, d, \dots$  which can take values true or false.

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**Codification** of Sentences of the argument into Boolean Formulae.

Developing the **Deduction Process** as obtaining truth of a **Combined Formula** expressing the complete argument.

**Determining the Truth or Validity** of the formula and thereby proving or disproving the argument and Analyzing its truth under various Interpretations.

If I am the Student President then I am well-known. I am the Student President. So I am well-known

### Coding: Variables

a: I am the Student President

b: I am well-known

### Coding the sentences:

F1:  $a \rightarrow b$

F2: a

G: b

The final formula for deduction:  $(F1 \wedge F2) \rightarrow G$ ,

that is:  $((a \rightarrow b) \wedge a) \rightarrow b$

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a	b	$a \rightarrow b$	$(a \rightarrow b) \wedge a$	$((a \rightarrow b) \wedge a) \rightarrow b$
T	T	T	T	T
T	F	F	F	T
F	T	T	F	T
F	F	T	F	T

## Deduction Using Propositional Logic: Example 2

**Atoms:** Choice of Boolean Variables  $a, b, c, d, \dots$  which can take values true or false.

**Boolean Formulae** developed using well defined connectors  $\sim, \neg, \wedge, \vee, \rightarrow, \Leftrightarrow$  etc, whose meaning (semantics) is given by their truth tables.

$P \rightarrow Q$  same as  $\sim P \vee Q$

**Codification** of Sentences of the argument into Boolean Formulae.

Developing the **Deduction Process** as obtaining truth of a **Combined Formula** expressing the complete argument.

**Determining the Truth or Validity** of the formula and thereby proving or disproving the argument and Analyzing its truth under various Interpretations.

If I am the Student President then I am well-known. I am not the Student President. So I am not well-known

**Coding: Variables**

a: I am the Student President

b: I am well-known

**Coding the sentences:**

F1:  $a \rightarrow b$

F2:  $\sim a$

G:  $\sim b$

The final formula for deduction:  $(F1 \wedge F2) \rightarrow G$ ,

that is:  $((a \rightarrow b) \wedge \sim a) \rightarrow \sim b$

a	b	$a \rightarrow b$	$(a \rightarrow b) \wedge \sim a$	$((a \rightarrow b) \wedge \sim a) \rightarrow \sim b$
T	T	T	F	T
T	F	F	F	T
F	T	T	T	F
F	F	T	T	T

## Deduction Using Propositional Logic: Example 3

If I am the Student President then I am well-known. I am the Student President. So I am well-known

**Coding: Variables**

a: I am the Student President

b: I am well-known

**Coding the sentences:**

F1:  $a \rightarrow b$

F2: a

G: b

The final formula for deduction:  $(F1 \wedge F2) \rightarrow G$ , that is:  $((a \rightarrow b) \wedge a) \rightarrow b$

a	b	$a \rightarrow b$	$(a \rightarrow b) \wedge a$	$((a \rightarrow b) \wedge a) \rightarrow b$
T	T	T	T	T
T	F	F	F	T
F	T	T	F	T
F	F	T	F	T

If Rajat is the Student President then Rajat is well-known. Rajat is the Student President. So Rajat is well known

**Coding: Variables**

a: Rajat is the Student President

b: Rajat is well-known

**Coding the sentences:**

F1:  $a \rightarrow b$

F2: a

G: b

The final formula for deduction:

$(F1 \wedge F2) \rightarrow G$ ,

that is:  $((a \rightarrow b) \wedge a) \rightarrow b$

## Deduction Using Propositional Logic: Example 4 & 5

If Asha is elected VP then Rajat is chosen as G-Sec and Bharati is chosen as Treasurer. Rajat is not chosen as G-Sec. Therefore Asha is not elected VP.

If Asha is elected VP then Rajat is chosen as GSec and Bharati is chosen as Treasurer. Rajat is chosen as G-Sec. Therefore Asha is elected VP.

## More Examples

If Asha is elected VP then Rajat is chosen as G-Sec or Bharati is chosen as Treasurer.

Rajat is not chosen as G-Sec. Therefore if Asha is elected as VP then Bharati is chosen as Treasurer.

If Asha is elected VP then either Rajat is chosen as GSec or Bharati is chosen as Treasurer but not both.

Rajat is not chosen as G-Sec. Therefore if Asha is elected as VP then Bharati is chosen as Treasurer

## Methods for Deduction in Propositional Logic

**Interpretation of a Formula**

Valid, non-valid, Satisfiable, Unsatisfiable

Decidable but NP-Hard

Truth Table Method

Faster Methods for validity checking:- Tree Method

Data Structures: Binary Decision Diagrams

Symbolic Method: Natural Deduction

Soundness and Completeness of a Method



## Methods for Deduction in Propositional Logic

### Interpretation of a Formula

Valid, non-valid, Satisfiable, Unsatisfiable

Decidable but NP-Hard

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Faster Methods for validity checking:- Tree Method

Data Structures: Binary Decision Diagrams

Symbolic Method: Natural Deduction

Soundness and Completeness of a Method

### NATURAL DEDUCTION:

Modus Ponens:

$(a \rightarrow b), a \vdash$  therefore  $b$

Modus Tollens:

$(a \rightarrow b), \neg b \vdash$  therefore  $\neg a$

Hypothetical Syllogism:

$(a \rightarrow b), (b \rightarrow c) \vdash$  therefore  $(a \rightarrow c)$

Disjunctive Syllogism:

$(a \vee b), \neg a \vdash$  therefore  $b$

Constructive Dilemma:

$(a \rightarrow b) \wedge (c \rightarrow d), (a \vee c) \vdash$  therefore  $(b \vee d)$

Destructive Dilemma:

$(a \rightarrow b) \wedge (c \rightarrow d), (\neg b \vee \neg d) \vdash$  therefore  $(\neg a \vee \neg c)$

Simplification:  $a \wedge b \vdash$  therefore  $a$

Conjunction:  $a, b \vdash$  therefore  $a \wedge b$

Addition:  $a \vdash$  therefore  $a \vee b$

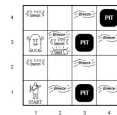
Natural Deduction is Sound and Complete

## Insufficiency of Propositional Logic

- Wherever Mary goes, so does the lamb. Mary goes to school. So the lamb goes to school.
- No contractors are dependable. Some engineers are contractors. Therefore some engineers are not dependable.
- All dancers are graceful. Ayesha is a student. Ayesha is a dancer. Therefore some student is graceful.
- Every passenger is either in first class or second class. Each passenger is in second class if and only if he or she is not wealthy. Some passengers are wealthy. Not all passengers are wealthy. Therefore some passengers are in second class.

## Limitations of Propositional Logic

- Does not scale to large size environments
- For the current WW
  - 64 proposition symbols
  - 155 sentences
- Lacks concise representations
- Propositional logic identify individual states but fail to associate with objects.
  - We would like to talk about objects and group of objects and relationships between them.
- Doesn't capture relations within objects
  - E.g., every pit would have a breeze in adjacent squares need to be written separately for each square, instead a simple relation should be able to encode the knowledge to every pit
  - E.g., Any sentence in natural language would contain objects (nouns, verbs) and relations (subject, object) between them



## First order Logic

or

## PREDICATE LOGIC

## Using Propositional Logic

### Representing simple facts

It is raining  
RAINING

It is sunny  
SUNNY

It is windy  
WINDY

If it is raining, then it is not sunny  
RAINING  $\rightarrow$   $\neg$ SUNNY

- If we want to represent

- Mohit is a man
  - Mohitman

- Rohit is a man
  - Rohitman

- Not able to draw any conclusion about similarities between Mohit and Rohit.

## Better Representation

MAN(MOHIT)  
MAN(ROHIT)

- Structure of representation reflects the structure of knowledge itself.
- Need to use predicate applied to arguments

All man are Mortal  
– MORTALMAN

– Need variable and quantification

## Methods for Deduction in First Order Logic

1. Wherever Mary goes, so does the lamb.  
Mary goes to school. So the lamb goes to school.

2. No contractors are dependable. Some engineers are contractors. Therefore some engineers are not dependable.

3. All dancers are graceful. Ayesha is a student. Ayesha is a dancer. Therefore some student is graceful.

4. Every passenger is either in first class or second class. Each passenger is in second class if and only if he or she is not wealthy. Some passengers are wealthy. Not all passengers are wealthy. Therefore some passengers are in second class.

### New Additions in Proposition (First Order Logic)

Variables,  
Constants,  
Predicate Symbols and  
New Connectors:  $\exists$  (there exists),  $\forall$  (for all)

Try Now

## Formulating Predicate Logic Statements

New Additions in Proposition (First Order Logic)  
Variables, Constants, Predicate Symbols and  
New Connectors:  $\exists$  (there exists),  $\forall$  (for all)

1. Wherever Mary goes, so does the Lamb.  
Mary goes to School. So the Lamb goes to School.

**Predicate:** goes(x,y) to represent x goes to y  
**New Connectors:**  $\exists$  (there exists),  $\forall$  (for all)  
F1:  $\forall x(\text{goes}(\text{Mary}, x) \rightarrow \text{goes}(\text{Lamb}, x))$   
F2: goes(Mary, School)  
G: goes(Lamb, School)  
**To prove:**  $(F1 \wedge F2) \rightarrow G$  is always true

2. No contractors are dependable. Some engineers are contractors. Therefore some engineers are not dependable.

**Predicates:** contractor(x), dependable(x), engineer(x)

F1:  $\forall x(\text{contractor}(x) \rightarrow \sim \text{dependable}(x))$   
[Alternative:  $\sim \exists x(\text{contractor}(x) \wedge \text{dependable}(x))$ ]

F2:  $\exists x(\text{engineer}(x) \wedge \text{contractor}(x))$

G:  $\exists x(\text{engineer}(x) \wedge \sim \text{dependable}(x))$

**To prove:**  $(F1 \wedge F2) \rightarrow G$  is always true

## More Examples

3. All dancers are graceful.  
Ayesha is a student. Ayesha is a dancer.  
Therefore some student is graceful.

4. Every passenger is either in first class or second class. Each passenger is in second class if and only if the passenger is not wealthy. Some passengers are wealthy. Not all passengers are wealthy. Therefore some passengers are in second class.

## Use of Quantifiers

### EXAMPLES:

Someone likes everyone  
Everyone likes someone  
There is someone whom everyone likes  
Everyone likes everyone  
If everyone likes everyone then someone likes everyone  
If there is a person whom everyone likes then that person likes himself

LAWS of NEGATION:

## Use of Function Symbols

If x is greater than y and y is greater than z then x is greater than z.

The age of a person is greater than the age of his child.

Therefore the age of a person is greater than the age of his grandchild.

The sum of ages of two children are never more than the sum of ages of their parents.

## Variables and Predicate / Function Symbols

Variables, Free variables, Bound variables

Symbols – proposition symbols, constant symbols, function symbols, predicate symbols

Variables can be quantified in first order predicate logic

Symbols cannot be quantified in first order predicate logic

Interpretations are mappings of symbols to relevant aspects of a domain

## Terminology for Predicate Logic

Domain: D  
 Constant Symbols: M, N, O, P, ....  
 Variable Symbols: x, y, z, ....  
 Function Symbols: F(x), G(x, y), H(x, y, z)  
 Predicate Symbols: p(x), q(x, y), r(x, y, z),  
 Connectors:  $\neg$ ,  $\wedge$ ,  $\vee$ ,  $\rightarrow$ ,  $\exists$ ,  $\forall$

Terms:  
 Well-formed Formula:  
 Free and Bound Variables:  
 Interpretation, Valid, Non-Valid,  
 Satisfiable, Unsatisfiable

## Validity, Satisfiability, Structure

F1:  $\forall x(\text{goes}(\text{Mary}, x) \rightarrow \text{goes}(\text{Lamb}, x))$   
 F2:  $\text{goes}(\text{Mary}, \text{School})$   
 G:  $\text{goes}(\text{Lamb}, \text{School})$   
 To prove:  $(F1 \wedge F2) \rightarrow G$  is always true

Is the same as:  
 F1:  $\forall x(\text{www}(\text{M}, x) \rightarrow \text{www}(\text{L}, x))$   
 F2:  $\text{www}(\text{M}, \text{S})$   
 G:  $\text{www}(\text{L}, \text{S})$   
 To prove:  $(F1 \wedge F2) \rightarrow G$  is always true

## More Examples : Predicate Logic

- Marcus was a man.
- Marcus was a Pompeian.
- All Pompeians were Romans.
- Caesar was a ruler.
- All Pompeians were either loyal to Caesar or hated him.
- Every one is loyal to someone.
- People only try to assassinate rulers they are not loyal to.
- Marcus tried to assassinate Caesar.

## Predicate Logic Example

- Marcus was a man.**  
 $\text{man}(\text{Marcus})$
- Marcus was a Pompeian.**  
 $\text{Pompeian}(\text{Marcus})$
- All Pompeians were Romans.**  
 $\forall x: \text{Pompeian}(x) \rightarrow \text{Roman}(x)$
- Caesar was a ruler.**  
 $\text{ruler}(\text{Caesar})$

## Predicate Logic Example

- All Pompeians were either loyal to Caesar or hated him.**  
 inclusive-or  
 $\forall x: \text{Pompeians}(x) \rightarrow \text{loyalto}(x, \text{Caesar}) \vee \text{hate}(x, \text{Caesar})$   
 exclusive-or  $p \oplus q = (p \wedge \neg q) \vee (\neg p \wedge q)$   
 $\forall x: \text{Pompeians}(x) \rightarrow (\text{loyalto}(x, \text{Caesar}) \wedge \neg \text{hate}(x, \text{Caesar})) \vee (\neg \text{loyalto}(x, \text{Caesar}) \wedge \text{hate}(x, \text{Caesar}))$
- Every one is loyal to someone.**  
 $\forall x: \exists y: \text{loyalto}(x, y)$   
 $\exists y: \forall x: \text{loyalto}(x, y)$
- People only try to assassinate rulers they are not loyal to.**  
 $\forall x: \forall y: \text{person}(x) \wedge \text{ruler}(y) \wedge \text{tryassassinate}(x, y) \rightarrow \neg \text{loyalto}(x, y)$
- Marcus tried to assassinate Caesar.**  
 $\text{tryassassinate}(\text{Marcus}, \text{Caesar})$

## First Order Logic – Inference

- First order logic has sentences with quantifiers which makes it hard for inference
- First order inference can be done by
  - reducing the knowledge base to propositional logic and
  - use propositional inference techniques

- Was Marcus loyal to Caesar?**
- Using 7 & 8 fact, we can predict
  - Backward chaining
    - $\text{man}(\text{Marcus})$
    - $\text{ruler}(\text{Caesar})$
    - $\text{tryassassinate}(\text{Marcus}, \text{Caesar})$
    - $\Downarrow \forall x: \text{man}(x) \rightarrow \text{person}(x)$
    - $\neg \text{loyalto}(\text{Marcus}, \text{Caesar})$

## Inferencing in Predicate Logic

Domain: D

Constant Symbols: M, N, O, P, ....

Variable Symbols: x, y, z, ....

Function Symbols: F(x), G(x, y), H(x, y, z)

Predicate Symbols: p(x), q(x, y), r(x, y, z),

Connectors:  $\neg$ ,  $\wedge$ ,  $\vee$ ,  $\rightarrow$ ,  $\exists$ ,  $\forall$

Terms:

Well-formed Formula:

Free and Bound Variables:

Interpretation, Valid, Non-Valid,

Satisfiable, Unsatisfiable

What is an Interpretation? Assign a domain set D, map constants, functions, predicates suitably.

The formula will now have a truth value

Example:

F1:  $\forall x(g(M, x) \rightarrow g(L, x))$

F2:  $g(M, S)$

G:  $g(L, S)$

Interpretation 1: D = {Akash, Baby, Home, Play, Ratan, Swim}, etc.,

Interpretation 2: D = Set of Integers, etc.,

How many interpretations can there be?

To prove Validity, means  $(F1 \wedge F2) \rightarrow G$  is true under all interpretations

To prove Satisfiability means  $(F1 \wedge F2) \rightarrow G$  is true under at least one interpretation

## Predicate and its Limitations

Russell's Paradox

(The barber shaves all those who do not shave themselves. Does the barber shave himself?)

- There is a single barber in town.
- Those and only those who do not shave themselves are shaved by the barber.
- Who shaves the barber?

Checking Validity of First order logic is undecidable but partially decidable (semi- decidable) {Robinson's Method of Resolution Refutation}

Higher order predicate logic - can quantify symbols in addition to quantifying variables.

$\forall p(p(O) \wedge (\forall x(p(x) \rightarrow p(S(x))) \rightarrow \forall y(p(y))$

## Home work

- Translate these sentences into following Logic.
  - a) Proposition logic
  - b) Predicate logic

“Mary likes all kinds of food. Pizza is a kind of food. Apple is a food. Anything anyone eats is a food. John eats chicken. Ana eats everything Mary eats.”

## Next :

- Module 4: Logic and Deduction
  - PART 4.1 : Knowledge Representation
  - PART 4.2 : Propositional logic
  - PART 4.3 : Predicate Logic
    - Propositional Logic to Predicate Logic
    - Predicate Logic Fundamentals
  - PART 4.5 : Deduction / Reasoning Tasks
  - PART 4.6 : Inference By Forward Chaining
  - PART 4.7 : Inferencing By Resolution Refutation
    - Reduction to satisfiability problem : SAT Solver
  -

## References

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- *Artificial Intelligence and Expert System* by Patterson
- <http://www.cs.rmit.edu.au/AI-Search/Product/>
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- *Artificial Intelligence and Expert System* by Patterson
- Slides adapted from CS188 Instructor: Anca Dragan, University of California, Berkeley
- Slides adapted from CS60045 ARTIFICIAL INTELLIGENCE



(some slides adapted from <http://aima.cs.berkeley.edu/>)