

# Chapter 11. Knowledge Representation and Reasoning

The Quest for Artificial Intelligence, Nilsson, N. J., 2009.

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Summarized by Ha, Jung-Woo and Lee, Beom-Jin

Biointelligence Laboratory  
School of Computer Science and Engineering  
Seoul National University

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# Overview

- Methods for knowledge representation and reasoning from Mid-1960s and Mid-1970s
  - Symbolic logic and its deductions
    - Predicate calculus
    - For proving theories
  - Situation calculus
  - Logic programming: PROLOG
  - Sematic networks: HAM, MEMS, MENTAL
  - Script and Frames

# Introduction

## ■ Knowledge

- For intelligent system
- The mean to draw conclusion from or act on

## ■ Knowledge representation

- Procedural
  - Coordinate and control the specific action (ex. hitting a tennis ball)
  - Programs using the knowledge
  - Specific task program
- Declarative
  - Declarative sentence (I am a 25 years old)
  - Symbolic structures
  - General task program

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# 11.1 Deductions in Symbolic Logic

# Deductions in Symbolic Logic

## ■ The predicate calculus

- From Aristotle to G. Boole and McCarthy

- Ex. Aristotle syllogism

- 1.  $(\forall x)[\text{Man}(x) \supset \text{Mortal}(x)]$

(The expression “ $(\forall x)$ ” is a way of writing “for all x”; and the expression “ $\supset$ ” is a way of writing “implies that.” “ $\text{Man}(x)$ ” is a way of writing “x is a man”; and “ $\text{Mortal}(x)$ ” is a way of writing “x is mortal.” Thus, the entire expression is a way of writing “for all x, x is a man implies that x is mortal” or, equivalently, “all men are mortal.”)

- 2.  $\text{Man}(\text{Socrates})$  (Socrates is a man.)

- 3. Therefore,  $\text{Mortal}(\text{Socrates})$  (Socrates is mortal.)

- “Therefore,” is an example of a *deduction*

- Rules of inference (ex. Modus ponens)

# Deductions in Symbolic Logic

- Early works on deduction in symbolic logic
  - Programs using inference rule (1960s) for proving theorems in the predicate calculus
    - P. Gilmore, H. Wang, and D. Prawitz (IBM)
    - F. Black (Harvard)
  - QA3 (Question Answering)
    - C. C. Green implemented a new deduction method developed by J. A. Robinson
      - From two other statements, a new statement is generated by rules (ex.  $P \vee \neg Q$  and  $P$  produces  $Q$ )
      - Key contribution: how resolution could be applied to general expressions in the predicate calculus
    - Example
- So just as with programs for playing games, LT, and proving geometry theorems, deduction programs need to try many possibilities in their search for a solution

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## **11.2 The Situation Calculus**



# The Situation Calculus

## ■ Situation calculus

- Where one could write logical statements that explicitly named the situation in which something or other was true
- Ex. “What is a program for rearranging a list of numbers so that they are in increasing numerical order?”
- Block case
  - block A is on top of block B in some situation S  
→  $\text{On}(A, B, S)$
  - block A is blue in all situations  
→  $(\forall s)\text{Blue}(A, s)$
  - there exists some situation in which block A is on block B  
→  $(\exists s)\text{On}(A, B, s)$
- QA3 can deduce situation calculus → robot plan

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## **11.3 Logic Programming**

# Logic Programming

- Green's automatic programming
  - QA3 can construct simple computer programs
  - The first attempt to write programs using logical statements
- SL-resolution : A. Kowalski and D. Kuehner
- PROLOG (1972)
  - A. Colmerauer, P. Roussel, and A. Kowalski
  - An ordered sequence of logical statements
  - The exact order in which these statements are written, along with some other constructs, is the key to efficient program execution

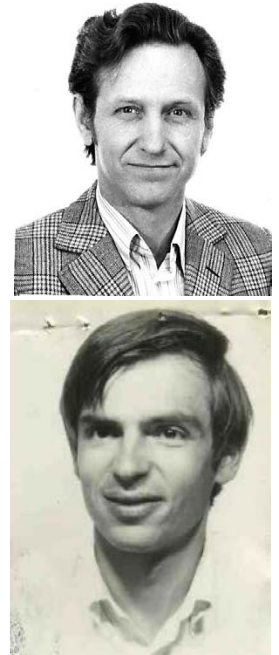


Figure 11.1: Robert Kowalski (top) and Alain Colmerauer (bottom)

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## **11.4 Semantic Networks**

# Semantic Networks

- **Semantic networks**
  - Another format for representing declarative knowledge
- **Human Associative Memory (HAM)**
  - G. Bower and J. Anderson (1970s)
  - Network-based human memory
  - Parse simple propositional sentences and store them in the semantic network structure
  - With accumulated memory, HAM can answer simple questions
- **MEMS and MENTAL: S. C. Shapiro (1971)**
  - MEMS: a network structure for storing semantic information
  - MENTAL: aided MEMS in deducing new information from that already stored
- **SNePS: S. C. Shapiro**
  - Combination of logical representation with those of network representations used for natural language understanding

# Semantic Networks

- Conceptual dependency representations for natural language sentences
  - R. C. Schank
  - People transform natural language sentences into “conceptual structures independent of the particular language where the sentences were expressed.



Figure 11.2: Roger Schank.

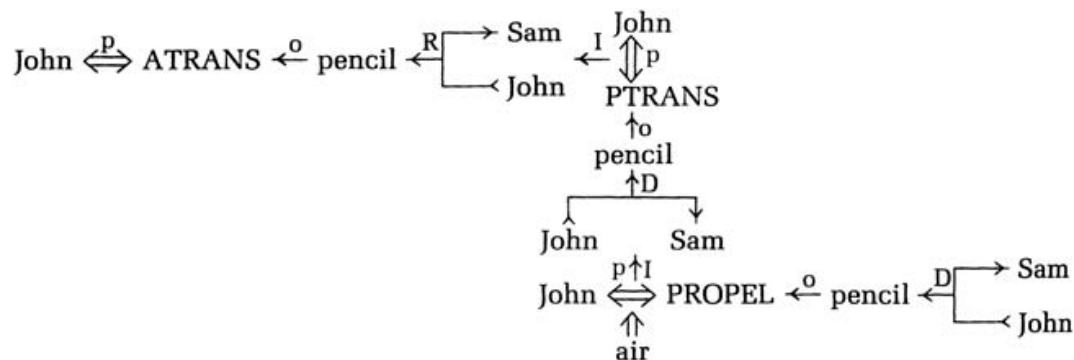


Figure 11.3: Conceptual structure for "John threw the pencil to Sam." (From Roger C. Schank, "Identification of Conceptualizations Underlying Natural Language," in Roger Schank and Kenneth Colby (eds.), *Computer Models of Thought and Language*, p. 226, San Francisco: W. H. Freeman and Co., 1973.)

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## **11.5 Scripts and Frames**

# Scripts and Frames

## ■ Graphical knowledge representations

- Semantic networks and conceptual structures
- Efficient computationally due to participating in the same chain of reasoning

## ■ Scripts

- Proposed by R. Schank and R. Abelson
- A script is a way of representing what they call “specific knowledge – detailed knowledge about a situation or event that “we have been through many times.”
- Example

## ■ Frames

- Proposed by M. Minsky
- a data-structure for representing a stereotyped situation, like being in a certain kind of living room, or going to a child's birthday party.
- Implementation: FRL and KRL



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# Appendix

# Deductions in Symbolic Logic

- QA3
  - Resolution-based deduction system
  - The advantage of resolution
    - Implemented in programs to make deductions from a set of logical statements consisting of “clauses”
  - Ex.
    - 1. ROBOT(Rob) (Rob is a robot.)
    - 2.  $(\forall x)[\text{MACHINE}(x) \supset \neg \text{ANIMAL}(x)]$   
(x is a machine implies that it is not an animal.)  
The system is then asked “Is everything an animal?” by having it attempt to deduce the statement
    - 3.  $(\forall x)\text{ANIMAL}(x)$   
QA3 answers “NO” and gives a “counterexample”
    - 4.  $x = \text{Rob}$   
(This indicates that  $\neg \text{ANIMAL}(\text{Rob})$  contradicts what was to be deduced.)

# Scripts and Frames



## ■ An example of scripts

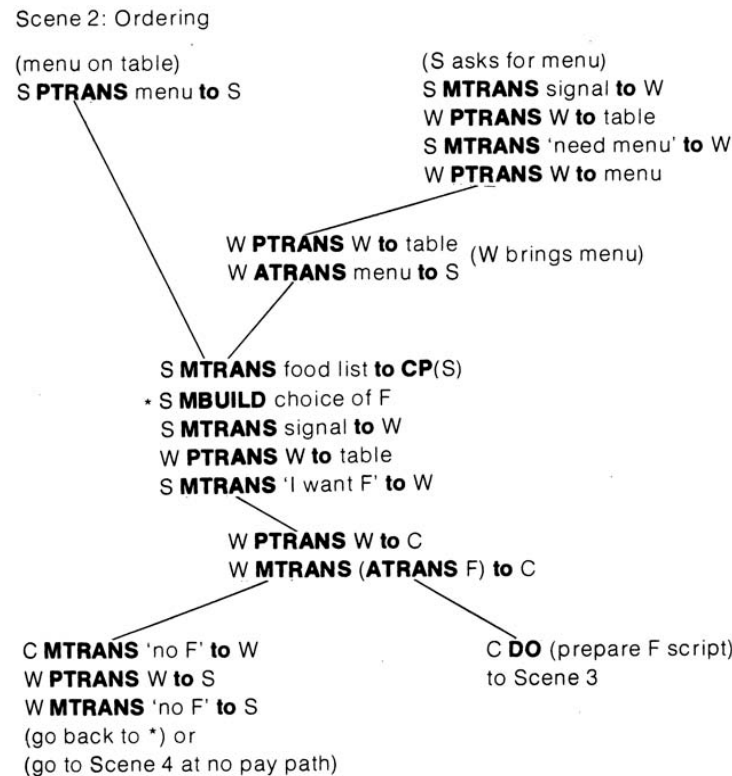


Figure 11.4: A scene in the restaurant script. (From Roger C. Schank and Robert P. Abelson, *Scripts, Plans, Goals, and Understanding: An Inquiry into Human Knowledge Structures*, p. 43, Hillsdale, NJ: Lawrence Erlbaum Associates, 1977.)