

# **Chapter Overview**

Rule-Based Reasoning

**Rules**

**Rule-Based Inference**

**Forward Reasoning**

**Backward Reasoning**

**Rule-Based Architectures**

**Advantages**

**Problems**

# Rules

important knowledge representation paradigm

## features

natural expression of knowledge  
especially empirical associations

## format

**if** -portion: condition, premise, antecedent  
**then** -portion: action, conclusion, consequent

## usage

draw conclusions based on available evidence

- rules are not the same as  
**If ... then ... else ...**  
constructs in procedural languages
- rules are not really logic systems
- rules-based systems are also called production systems

# Rule-Based Inference

reasoning method

## **modus ponens**

A is true, and

$A \rightarrow B$  is true

then B is derived to be true

## **searching**

start from available information, and try to combine it so that the desired conclusions are supported

## **pattern matching**

make sure that the chaining between facts and rules is correct

Differences to logic (deduction):

- non-monotonic reasoning
- uncertainty
- often forward reasoning

# Forward Reasoning

also: *forward chaining, data-driven reasoning*

## principle

combine available data to formulate conclusions

## rule selection

premises must be satisfied

## usage

few facts, many acceptable conclusions

## applications

synthesis; design, configuration, planning, scheduling

close to bottom-up evaluation

# Forward Reasoning Process

Rule interpretation

## **matching**

known facts are compared with the premises  
of rules

if all premises of a rule are true, it is satisfied

## **conflict resolution**

if multiple rules are satisfied, one must be  
selected

## **execution**

the selected rule is applied

new facts or rules can be generated

execution of rules proceeds forward, from premises ( **if** ) to conclusions ( **then** )

# Backward Reasoning

also: *backward chaining, goal-driven reasoning*

## principle

find supporting evidence for a possible conclusion

## rule selection

goals that match premises

## usage

few possible conclusions, many facts, but only a few are relevant

## applications

diagnostic problems

close to top-down evaluation and depth-first search

# Backward Reasoning Process

find supporting evidence

## top-level goals

collect all goals to be tried

put them on a stack

## select goal

take one goal and determine all rules capable of satisfying that goal

consequents of the rules must match the goal

## check applicable rules

for each of these rules, examine the premises

a) if all premises are satisfied, a rule can be executed, and the goal is solved

b) if a premise is not satisfied, look for rules that may satisfy it, and place the premise as *sub-goal* on the stack

continue with the next goal

c) if there is no such rule, query the user;  
if the answer is satisfactory, continue with

the next premise,  
otherwise go to the next rule

## **unsatisfied goals**

if no rule satisfies the current goal, it remains undetermined

it is removed from the stack, and the next one is tried

if the stack is empty, we're done

the known fact base initially is empty; at the end, it contains facts supporting the goal

# **Rule-Based Architectures**

for different types of knowledge

## **Inference Networks**

knowledge base can be visualized as a network of interconnected facts and rules

## **Pattern-Matching Systems**

not easily visualizable

conclusions are derived from facts and rules according to the matching of (intermediate) facts and premises

# Inference Networks

varyiations of semantic networks

## representation

- directed, acyclic graph with facts as nodes
- and rules specifying the links
- static knowledge structure: all links are known in advance
- often based on taxonomies

## principle

- results are propagated through the network

## implementation

- simple and efficient:
- predetermined search space
- limitations on variable bindings

## **usage**

diagnostics or classification for reasonably well-understood problems  
often with uncertainty for parameter values and rules

## **examples**

MYCIN, PROSPECTOR, GENAID, PERSONAL CONSULTANT

frequently based on backward reasoning

# Pattern-Matching Systems

match premises of rules to facts

## representation

rules and facts

dynamic knowledge structure: relationships  
between rules and facts  
are formed at run-time

## principle

intermediate results are created according to  
matching between the premises of a rule and  
facts, and the actions in the consequent of a  
rule

## implementation

complex and possibly inefficient

more expressive than inference networks

incrementally developed search space

complex pattern matching with multifield  
facts, multifield patterns, full variable  
bindings, multiple instantiations for variables

## **usage**

problems with unbound or plentiful solutions,  
e.g. in design, planning, synthesis  
uncertainty is more difficult to integrate

## **examples**

XCON, OPS-5, ART, CLIPS, KEE

historically, frequently based on forward reasoning

# Essential Features

of pattern-matching systems

## **pattern connectives**

relations between the premises of a rule  
usually AND (implicit)

## **wildcards**

term that can match any atomic symbol or number within a fact  
similar to variable, but no binding occurs  
often used to disregard irrelevant fields

## **field constraints**

negation or disjunction to specify (un-)acceptable values for a field

## **mathematical operators**

for calculations of values

## **test feature**

used to evaluate the value of a field

# **Advantages**

of rule-based systems

## **modularity**

rules are distinct units of knowledge

## **uniformity**

all knowledge is expressed in the same format

## **naturalness**

rules are a natural format for expressing  
knowledge

# Problems

of rule-based systems

## **infinite chaining**

cycles between rules

## **contradictions by new knowledge**

new knowledge intended to fix a problem may introduce a unwanted contradictions

## **modifications of existing rules**

in addition to infinite chaining and contradictions, additional rules may result from modifications

## **inefficiency**

search based on pattern matching with each rule is very inefficient

improvements: Rete algorithm, partitioning

## **opacity**

the overall behavior of the system can be difficult to understand because a global perspective is hard to achieve

## **domain coverage**

certain problems are too complex

e.g. too many variations of rules, unclear relationships

# Chapter Review

## Rule-Based Reasoning

**Rules:** basic unit of knowledge

### Rule-Based Inference

conclusions based on rules and facts

### Forward Reasoning

from available data to conclusions

### Backward Reasoning

find evidence for a possible conclusion

### Rule-Based Architectures

inference networks, pattern-matching systems

## Advantages

modularity, uniformity, naturalness

## Problems

infinite chaining, contradictions by new knowledge, modifications of existing knowledge; inefficiency, opacity, domain coverage