## 7. <br> Rules in Production Systems

## Direction of reasoning

A conditional like $P \Rightarrow Q$ can be understood as transforming

- assertions of $P$ to assertions of $Q$
- goals of $Q$ to goals of $P$

Can represent the two cases explicitly:

$$
\begin{aligned}
& (\text { assert } P) \Rightarrow(\text { assert } Q) \\
& (\text { goal } Q) \Rightarrow(\text { goal } P)
\end{aligned}
$$

and then distinguish between

1. goal vs. data directed reasoning

- goal: from $Q$ towards $P$
- data: from $P$ towards $Q$

2. forward vs. backward-chaining

- forward: along the $\Rightarrow$
- backward: against the $\Rightarrow$

Possible to have

- (proc if-added (mygoal $Q$ ) ... (mygoal $P$ ))
- (proc if-needed (myassert $P$ )... (myassert $Q$ ))

How to do data-directed reasoning in Prolog
Now: a formalism with forward-chaining

## Production systems

Idea: working memory + production rule set
Working memory: like DB, but volatile
Production rule: IF conditions THEN actions
condition: tests on WM
action: changes to WM
Basic operation: cycle of

1. recognize
find conflict set: rules whose conditions are satisfied by current WM
2. resolve
determine which of the rules will fire
3. act
perform required changes to WM
Stop when no rules fire

## Working memory

Set of working memory elements (WME)
Each WME is of the form (type attr val $_{1}$ attr $_{2}$ val $_{2} \ldots$ attr $_{n} v a l_{n}$ ) where type, attr $_{i}$, val $_{i}$ are all atoms

Examples: (person age 27 home Toronto)
(goal task openDoor importance 5)
(student name JohnSmith dept CS)
Understood as $\exists x\left[\right.$ type $\left.(x) \wedge \operatorname{attr}_{1}(x)=\operatorname{val}_{1} \wedge \ldots \wedge \operatorname{attr}_{n}(x)=\operatorname{val}_{n}\right]$

- individual is not explicitly named
- order of attributes is not significant

Can handle n -ary relations as usual
(myAssertion relation OlderThan firstArg John secondArg Mary)

## Rule conditions

Conditions: tested conjunctively
a condition is $p$ or $-p$, where $p$ is a pattern of the form
(type attr spec $_{1} \ldots$ attr $_{k}$ spec $_{k}$ )
where each specification must be one of

## Examples:

(person age $[n+4]$ occupation $x$ )

- (person age $\{<23 \wedge>6\}$ )
- an atom
- an expression within []
- a variable
- a test, within $\}$
- the $\wedge, \vee, \neg$ of a specification

A rule is applicable if there are values of the variables to satisfy all the conditions

- for a pattern, need WME of the correct type and for each attr in pattern, val must match spec
- for $-p$, there must be no WME that matches $p$


## Rule actions

Actions: performed sequentially
An action is of the form

- ADD pattern
- REMOVE index
- MODIFY index (attr spec)
where
- index $i$ refers to the WME that matched $i$-th pattern (inapplicable to $-p$ )
- variables and expressions refer to values obtained in the matching

Examples:

IF (Student name $x$ )
THEN ADD (Person name $x$ )
ordinary forward chaining

IF (Person age $x$ ) (Birthday)
THEN REMOVE 2
MODIFY 1 (age $[x+1]$ )
database update

IF (starting)
THEN REMOVE 1
ADD (phase val 1) control information

## Example 1

Placing bricks in order of size
largest in place 1, next in place 2, etc.
Initial working memory
(counter index 1)
(brick name A size 10 place heap)
(brick name B size 30 place heap)
(brick name C size 20 place heap)

## Production rules:

IF (brick place heap name $n$ size $s$ ) -(brick place heap size $\{>s\}$ ) -(brick place hand)
THEN MODIFY 1 (place hand)
IF (brick place hand) (counter index $i$ )
THEN MODIFY 1 (place $i$ )
MODIFY 2 (index [i+1])
put the largest brick in your hand
put a brick in your hand at the next spot

## Trace

Only one rule can fire at a time, so no conflict resolution is required

The following modifications to WM

1. (brick name B size 30 place hand)
2. (brick name B size 30 place 1 )
(counter index 2)
3. (brick name C size 20 place hand)
4. (brick name C size 20 place 2 )
(counter index 3)
5. (brick name A size 10 place hand)
6. (brick name A size 10 place 3 )
(counter index 4)
So the final working memory is

| (counter index 4) |
| :--- |
| (brick name A size 10 place 3) |
| (brick name B size 30 place 1) |
| (brick name C size 20 place 2) |

## Example 2

How many days are there in a year?
Start with: (want-days year $n$ )
End with: (has-days days $m$ )

1. IF (want-days year $n$ )

THEN REMOVE 1
ADD (year $\bmod 4[n \bmod 4]$
$\bmod 100[n \bmod 100]$
$\bmod 400[n \bmod 400])$
2. IF (year mod400 0)
then remove 1 ADD (has-days days 366)
3. IF (year mod100 $0 \bmod 400\{\neq 0\}$ )
then remove 1 ADD (has-days days 365)
4. IF (year $\bmod 40 \bmod 100\{\neq 0\})$
then remove 1 ADD (has-days days 366)
5. IF (year $\bmod 4\{\neq 0\}$ )

THEN REMOVE 1 ADD (has-days days 365)

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## Applications

## 1. Psychological modeling

| IF | (goal is get-unit-digit) | fine-grained modeling of symbol |
| :--- | :--- | :--- |
| (minuend unit $d$ ) | manipulation performed by people |  |
|  | (subtrahend unit $\{>\mathrm{d}\})$ | during problem solving |

THEN REMOVE 1
ADD (goal is borrow-from-tens)

## 2. Expert systems

rules used by experts in a problem area to perform complex tasks (examples later)

## Claimed advantages:

- modularity: each rule acts independently of the others
- fine-grained control: no complex goal or control stack
- transparency: can recast rules in English to provide explanation of behaviour


## System developed at Stanford to aid physicians in treating bacterial infections

Approximately 500 rules for recognizing about 100 causes of infection

IF
the type of $x$ is primary bacteremia
the suspected entry point of $x$ is the gastrointestinal tract
the site of the culture of $x$ is one of the sterile sites
THEN
there is evidence that $x$ is bacteroides

## $+$

other more static data structures (not in WM)

- lists of organisms
- clinical parameters


## Certainty factors

numbers from 0 to 1 attached to conclusions to rank order alternatives
AND - take min OR - take max
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## XCON

System developed at CMU (as R1) and used extensively at DEC (now owned by Compaq) to configure early Vax computers

Nearly 10,000 rules for several hundred component types
Major stimulus for commercial interest in rule-based expert systems

IF
the context is doing layout and assigning a power supply an sbi module of any type has been put in a cabinet
the position of the sbi module is known
there is space available for the power supply
there is no available power supply
the voltage and the frequency of the components are known THEN
add an appropriate power supply

## Context switching

XCON and others use rules of the form
IF the current context is $x$
THEN deactivate $x$ activate context $y$
organized to fire when no other rules apply
Useful for grouping rules

```
IF (control phase 1) AND ...
THEN ...
...
IF (control phase 1) AND ...
THEN ... MODIFY 1 (phase 2) ...
IF (control phase 2) AND ...
THEN ...
...
IF (control phase 2) AND ...
THEN ... MODIFY 1 (phase 3) ...
```


## Conflict resolution

Sometimes with data-directed reasoning, we want to fire all applicable rules

With goal-directed reasoning, we may want a single rule to fire

- arbitrary
- first rule in order of presentation (as in Prolog)
- specificity, as in

IF (bird) THEN ADD (can-fly)
IF (bird weight $\{>100\}$ ) THEN ADD (cannot-fly)
IF (bird) (penguin) THEN ADD (cannot-fly)

- recency
- fire on rule that uses most recent WME
- fire on least recently used rule
- refractoriness
- never use same rule for same value of variables (called rule instance)
- only use a rule/WME pair once (will need a "refresh" otherwise)


## Conflict combinations

## OPS5:

1. discard rule instances that have already been used
2. order remaining instances in terms of recency of WME matching 1st condition (and then of 2nd condition, etc.)
3. if still no single rule, order rules by number of conditions
4. select arbitrarily among those remaining

## SOAR:

system that attempts to find a way to move from a start state to a goal state by applying productions

> selecting what rule to fire
> $\equiv$
> deciding what to do next
if unable to decide, SOAR sets up the selection as a new (meta-)goal to solve, and the process iterates

## Rete procedure

Early systems spent $90 \%$ of their time matching, even with indexing and hashing.

But: - WM is modified only slightly on each cycle

- many rules share conditions

So: - incrementally pass WME through network of tests

- tokens that make it through satisfy all conditions and produce conflict set
- can calculate new conflict set in terms of old one and change to WM

IF (Person father $y$ age $\{<14\}$ name $x$ )
(Person name $y$ occupation doctor)
THEN ...


