

# Knowledge-Based Systems



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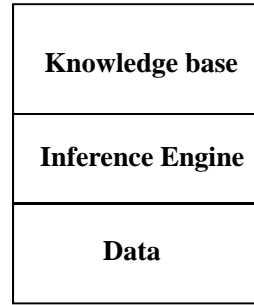
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# Expert System



**Expert system =  
 Structured  
 computer  
 program**

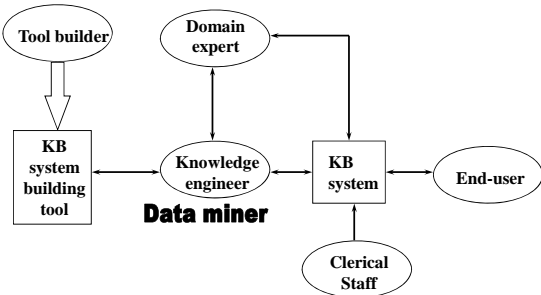


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## Traditional Process

### Development of KB Systems

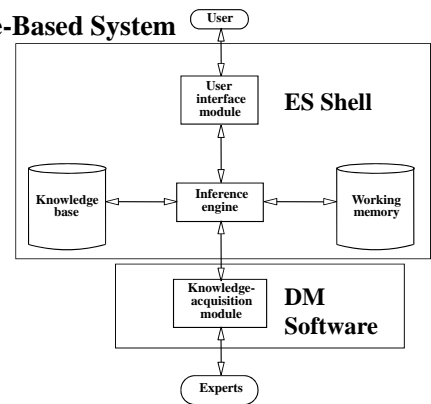


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## Components

### Knowledge-Based System



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## Knowledge Representation Methods

- First-order logic
- **Production rules**  
(including structured production rules)
- Frames
- Semantic networks



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## Production Rules

**IF** (conditions)  
**THEN** (conclusions)

### EXAMPLE

**IF** part  $P_i$  is to be dispatched to machine  $M_a$  that is occupied by another part  $P_j$

**THEN** check availability of an alternative machine  $M_b$



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## Advantages of Production Rules

- The use of a rule can be easily explained to the system user
- Developers and users can modify some rules without breaking the entire system
- New knowledge can be incorporated into the system simply by adding new rules without concern of how they fit into the overall knowledge base

**Simplicity**



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## Basic Reasoning Strategies

- Forward reasoning
- Backward reasoning

### Example

**Rules Base:** R1: IF a AND b THEN Goal  
R2: IF c AND d THEN a  
R3: IF e THEN c

<http://www.exsys.com/>



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**R1: IF a AND b THEN Goal**

**IF subassembly a AND subassembly b  
are available  
THEN initiate the assembly process**

**R2: IF c AND d THEN a**

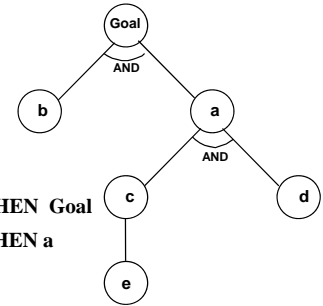
**IF part c AND part d have been assembled  
THEN subassembly a is available**



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### Inference (And/OR) tree



**Rules: R1: IF a AND b THEN Goal**

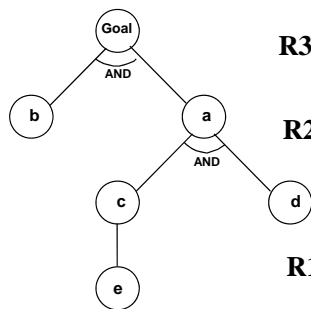
**R2: IF c AND d THEN a**

**R3: IF e THEN c**



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**R3: IF sunny, THEN  
hot inside**  
c

**R2: IF hot inside AND  
humid, THEN use AC**  
d a

**R1: IF use AC AND many  
people, THEN switch  
on unit 2**  
b Goal

**R1: IF a AND b THEN Goal**

**R2: IF c AND d THEN a**

**R3: IF e THEN c**

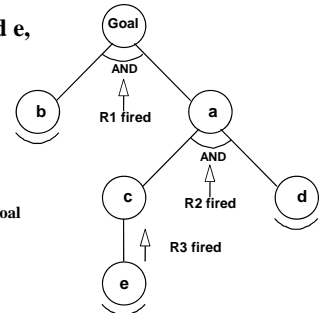


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### Forward Reasoning

**Given the facts: b, d, and e,  
derive a goal**



**Rules: R1: IF a AND b THEN Goal**

**R2: IF c AND d THEN a**

**R3: IF e THEN c**

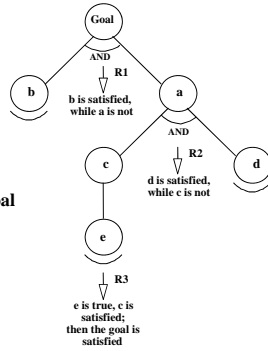


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## Backward Reasoning

Given the goal,  
derive facts that prove it



- Rules: R1: IF a AND b THEN Goal  
R2: IF c AND d THEN a  
R3: IF e THEN c



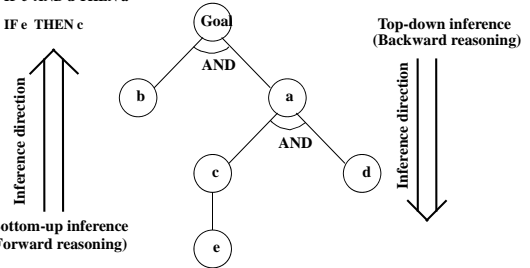
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## Reasoning Summary

- Forward reasoning
- Backward reasoning

- Rules: R1: IF a AND b THEN Goal  
R2: IF c AND d THEN a  
R3: IF e THEN c



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## Uncertainty in Rule Bases

- Rule R1: IF A1 AND B1 THEN D1

Given certainty factors:

$$\begin{aligned} CF(A1) &= CA1 \\ CF(B1) &= CB1 \end{aligned}$$

The certainty factor of rule R1

$$\begin{aligned} CF(D1) &= CF(R1) = CF(A1 \text{ AND } B1) \\ &= \min\{CF(A1), CF(B1)\} \\ &= \min\{CA1, CB2\} \end{aligned}$$



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- Rule R2: IF A2 OR B2 THEN D2

The certainty factor of Rule R2

$$\begin{aligned} CF(D2) &= CF(R2) = CF(A2 \text{ OR } B2) \\ &= \max\{CF(A2), CF(B2)\} \\ &= \max\{CA2, CB2\} \end{aligned}$$



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- Rule R3: IF A1 AND B1 THEN D1 CF = c

Certainty factor of R3

$$CF(D1) = CF(R3) = \min\{CA1, CB1\} c$$

- Rule R4: IF A2 OR B2 THEN D2 CF = c

Certainty factor of R4

$$CF(D2) = CF(R4) = \max\{CA2, CB2\} c$$



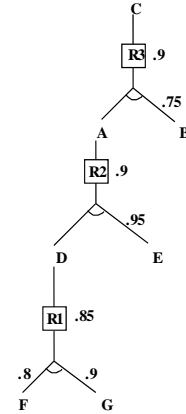
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## Example

AND/OR tree with three rules

- R1: IF F AND G THEN D
- R2: IF D AND E THEN A
- R3: IF A AND B THEN C



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### Given

$CF(F) = .8$ ,  $CF(G) = .9$ ,  $CF(E) = .95$ , and  $CF(B) = .75$

and

certainty factors of rules R1, R2, and R3

$CF(R1) = .85$ ,  $CF(R2) = .9$ , and  $CF(R3) = .9$

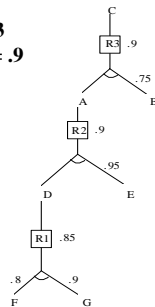
### Determine

Certainty factors of D, A, and C

$$CF(D) = \min\{CF(F), CF(G)\} \cdot CF(R1) = .6800$$

$$CF(A) = \min\{CF(D), CF(E)\} \cdot CF(R2) = .6120$$

$$CF(C) = \min\{CF(A), CF(B)\} \cdot CF(R3) = .5508$$



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Given two production rules and the corresponding certainty factors:

Rule R1: IF A1 AND B1 THEN D CF = c1

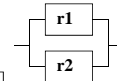
Rule R2: IF A2 OR B2 THEN D CF = c2

### The combined evidence

$$CF(R1, R2) = c1 + c2 - c1 * c2$$

$$= c1 + c2(1 - c1)$$

Reliability analogy



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**EXAMPLE: Combined Evidence**

**Rule R1:** IF the inflation rate is less than 5%  
THEN stock market prices go up  
CF = c1 = 0.7

**Rule R2:** IF unemployment rate is less than 7%  
THEN stock market prices go up  
CF = c2 = 0.6

**The combined evidence is computed as follows:**

$$CF(R1, R2) = c1 + c2 - c1 * c2 = 0.7 + 0.6 - 0.42 = 0.88$$



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**KNOWLEDGE ACQUISITION  
METHODS**

- **KB system interfaces**
- **Protocol analysis**
- **Neural networks**
- **Data mining**



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