

**JTRE/JSAIN**

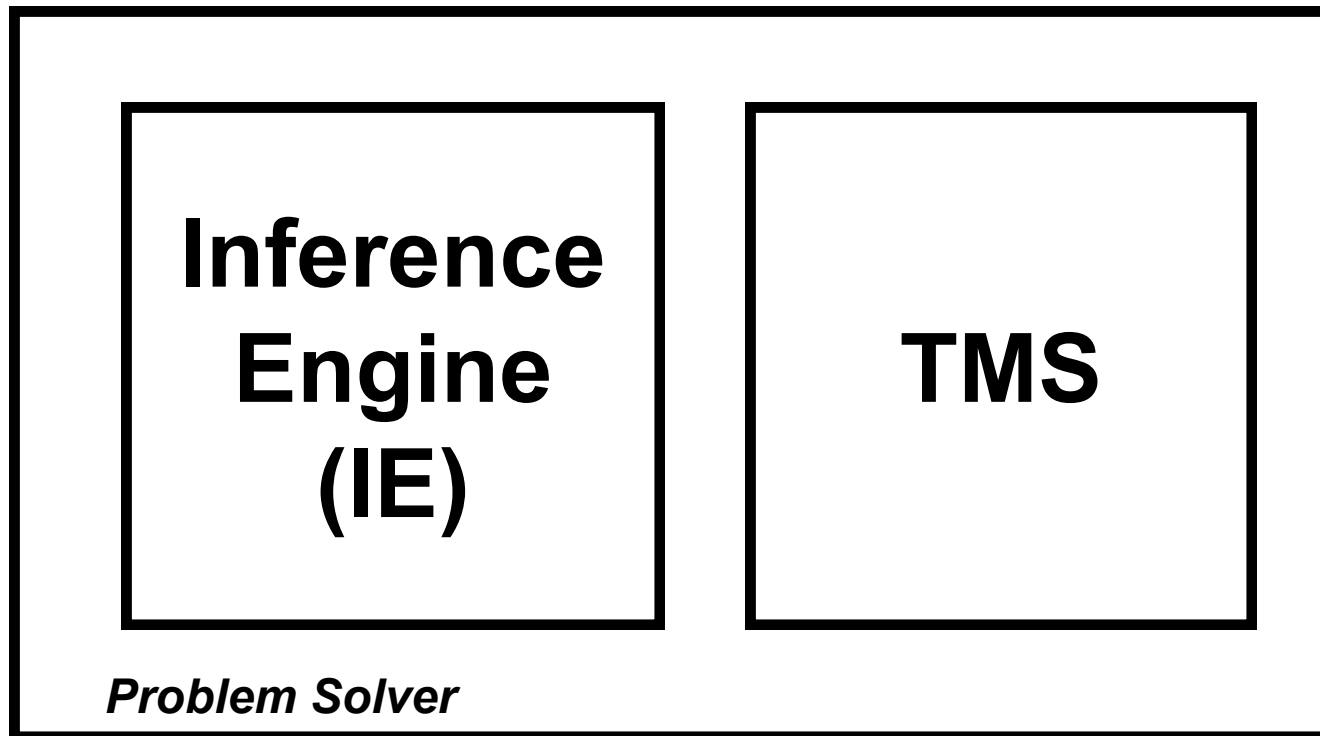
**EECS 344 Winter 2008**

# **Putting the JTMS to Work**

# Outline

- **Interface between a JTMS and a rule engine**
- **Chronological Search versus Dependency Directed Search: A Playoff**
- **Using a TMS in a problem solver: JSAINT design issues**

# Review: Problem Solver = TMS + Inference Engine



# The five basic actions of a TMS

- **Create Nodes**
- **Accepts records of IE deductions (as justifications)**
- **Computes the correct label for nodes and supplies them on request.**
  - Derives consequences of assumptions & premises based on dependency network
  - When assumptions are retracted, their consequences are retracted
  - Provides explanations for belief e.g., chains of *well-founded support*
- **Detects contradictory beliefs**
  - Based on contradiction nodes, explicit dependencies
- **TMS accepts rules from IE to be scheduled for execution when particular belief conditions are met.**

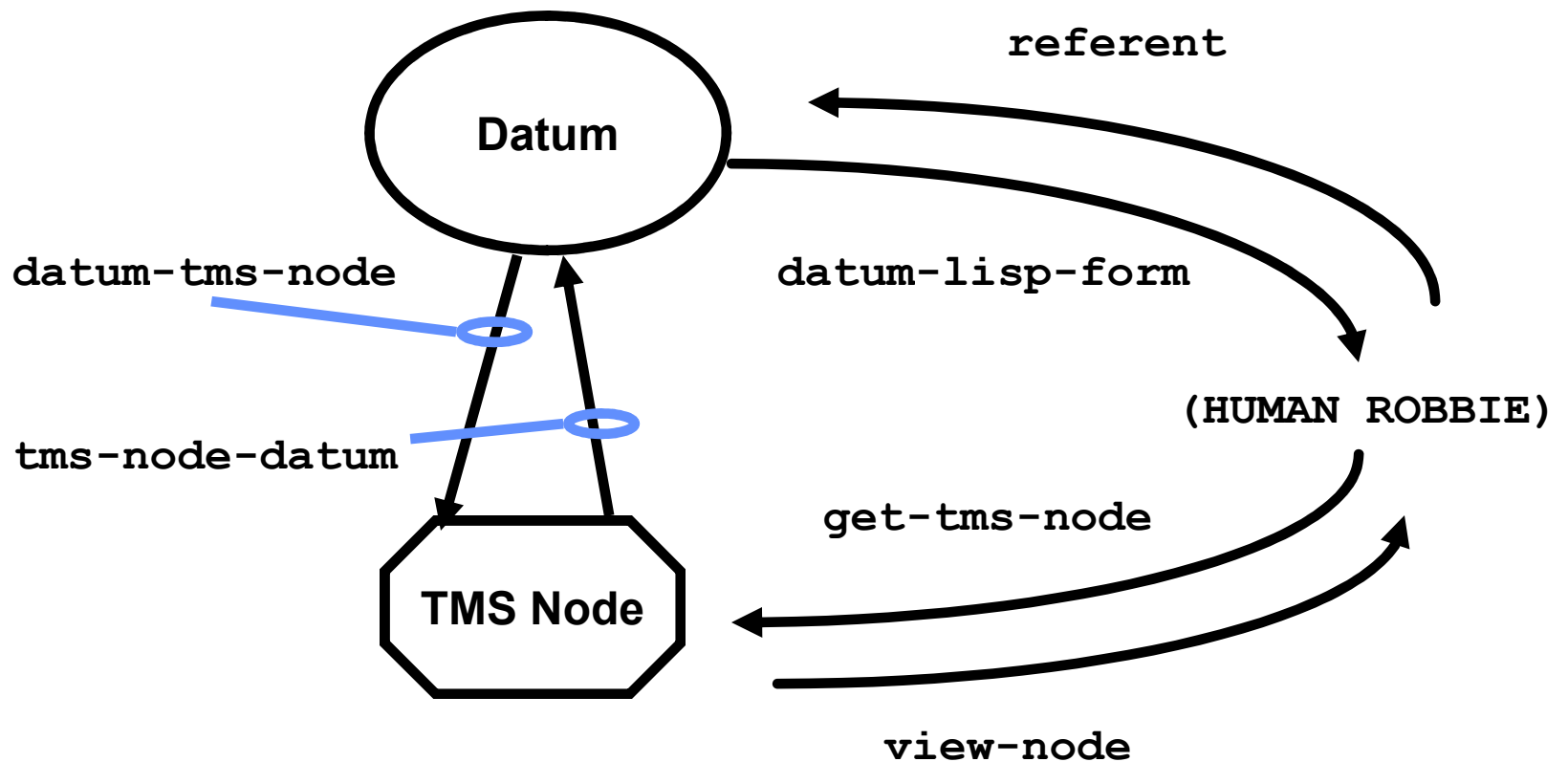
# Constraints on the IE

- 1. Provide mapping between IE and TMS data structures**
  - IE must inform TMS when a new node is needed
  - Must be able to retrieve the TMS node associated with an assertion.
- 2. Provide facilities for changing beliefs and expressing dependency relations.**
  - Marking assertions as PREMISEs or ASSUMPTIONs, and for enabling/retracting assumptions.
  - Provide facilities for representing justifications.
- 3. Provide facilities for inspecting system's beliefs (node labels)**
- 4. Provide facilities for contradiction handling.**
- 5. Provide methods for tying the execution of rules to belief states.**
  - Allow including constraints on beliefs in conditions for rules
  - Ensure both belief constraints and syntactic matching constraints are met before rules are run.

# Inference Engine services

- Provides *reference mechanism*
  - e.g., assertions, pattern matching
- Provides *procedures*
  - e.g., rules
- Provides *control strategy*

# 1. Mapping Assertions to TMS nodes





## 2. Justifying assertions in terms of other beliefs

- (assert! *<fact>*  
    (*<informant>* . *<antecedents>*))  
    installs a justification
- (assert! *<fact>* *<Anything else>*)  
    makes a premise
- (assume! *<fact>* *<reason>*)  
    makes an assumption
- rassume!, rassert! as before
- retract! disables an assumption
- (contradiction *<fact>*)  
    installs a contradiction

# 3. Queries concerning Belief States

- in?
- out?
- why?
- assumptions-of
- fetch
- wfs

# 4. Handling Contradictions

- (with-contradiction-handler  
    <jtms> <handler>  
    . <body>)
- We'll see example with N-queens problem

# 5. Tying rule execution to belief states

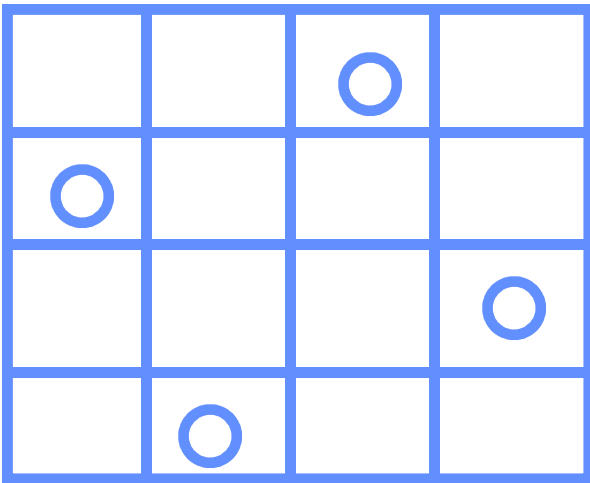
- `(rule <list of triggers> <body>)`
- Triggers are `(<condition> <pattern>)`
- **Types of conditions**
  - `:IN`
  - `:OUT`
  - `:INTERN`
- **Trigger options**
  - `:VAR`
  - `:TEST`

# Examples of rules

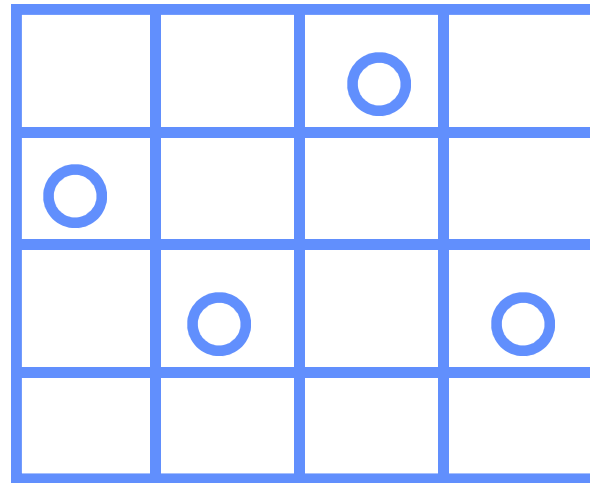
```
(rule ((:in (implies ?p ?q) :var ?f1)
      (:in ?p))
      (rassert! ?q (CE ?f1 ?p)))
```

```
(rule ((:in (show ?p) :var ?f1)
      :test (not
             (logical-connective? ?p)))
      (rassert! ((show ?p) Indirect-Proof
                 :PRIORITY Low)
                 (BC-IP ?f1)))
```

# Search Example: The N-Queens problem



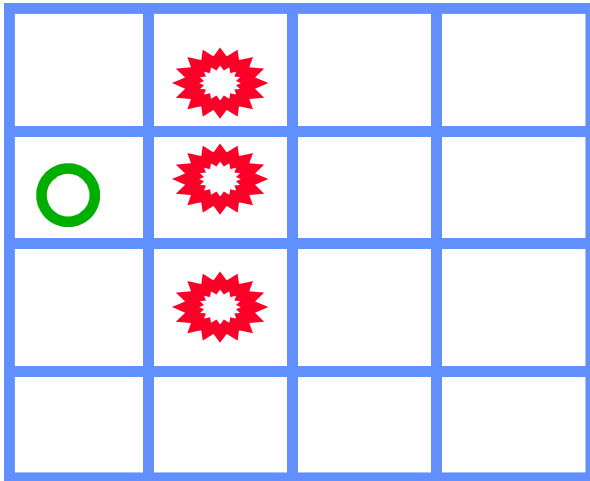
Good solution



Bad solution

# Chronological Search solution

- **Given NxN board**
  - Create a choice set for placing a queen in each column
  - Unleash rules that detect captures
  - Systematically search all combinations of choices



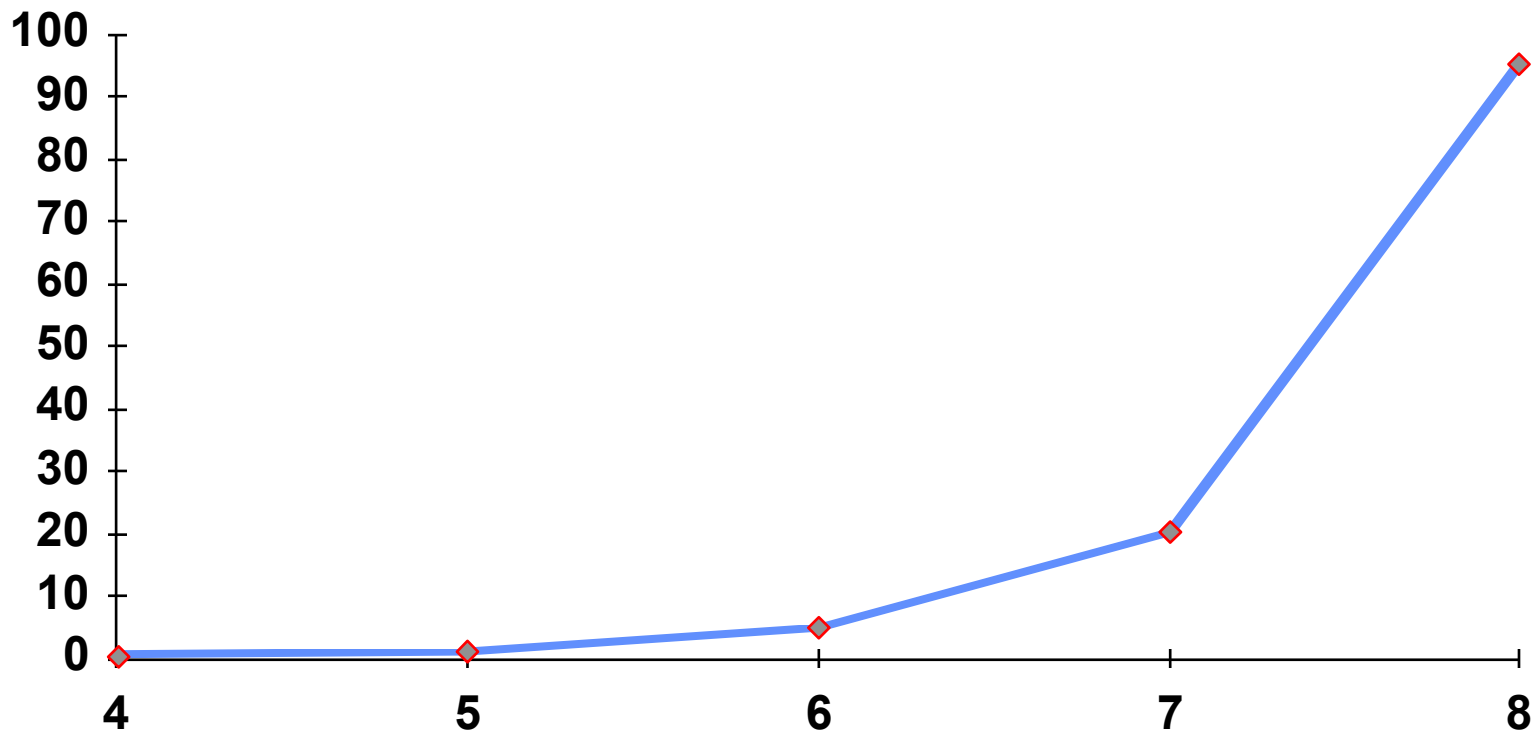
# Dependency Directed Search Solution

- **Like chronological search solution, but**
  - When inconsistent combination found, assert negation of queen statement. (Creating a *nogood*)
  - When searching, check for a nogood before trying an assumption.

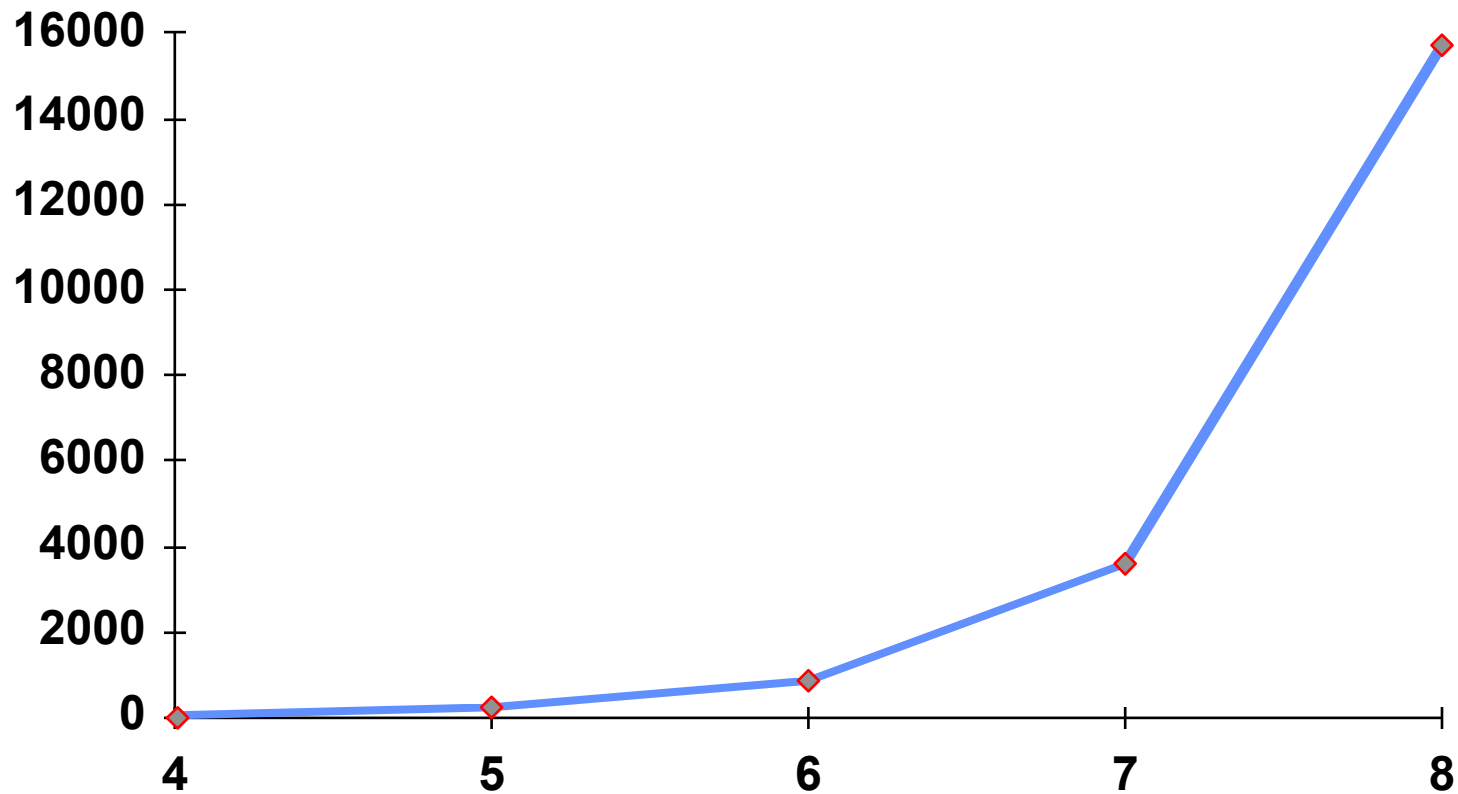


# Chronological Search: Time required

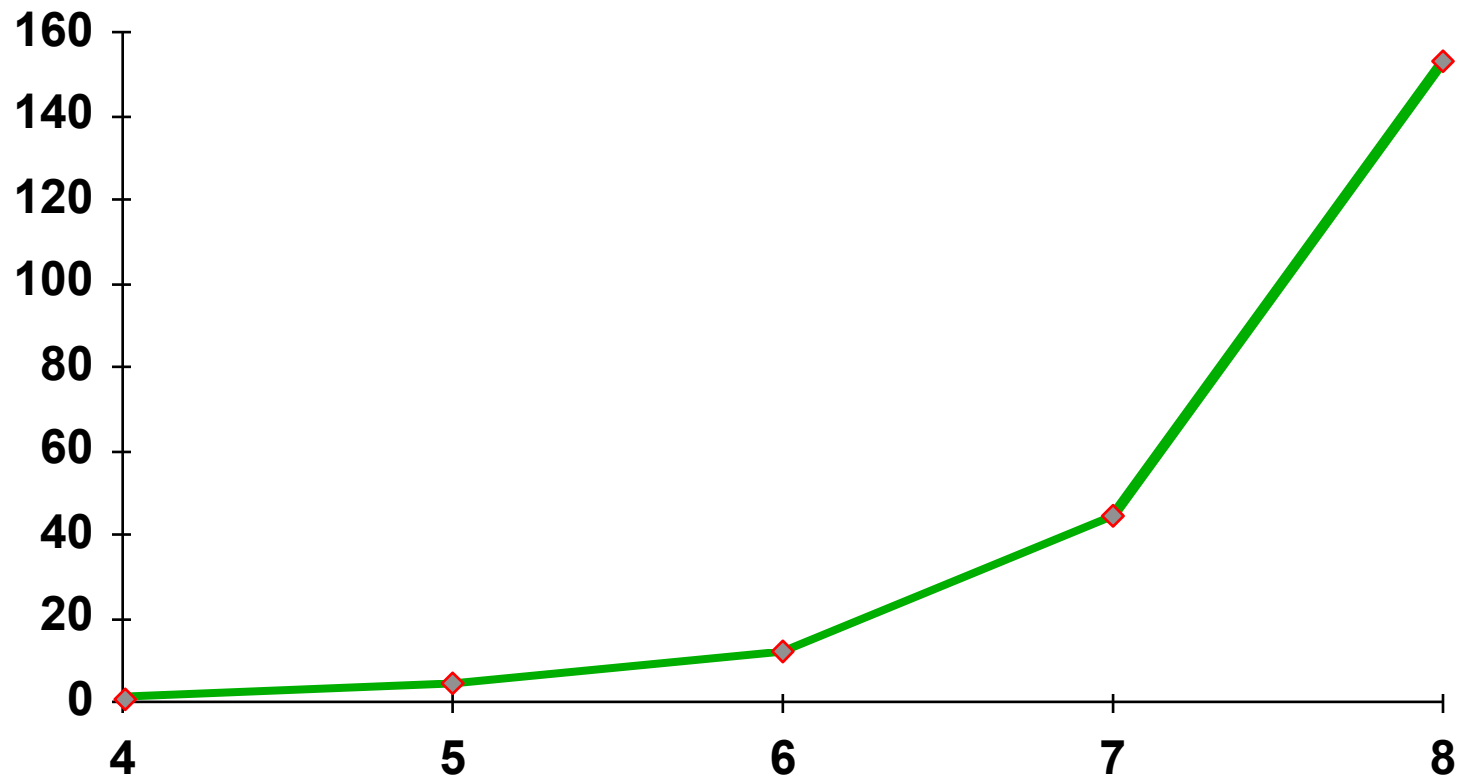
- IBM RT, Model 125, 16MB RAM, Lucid CL



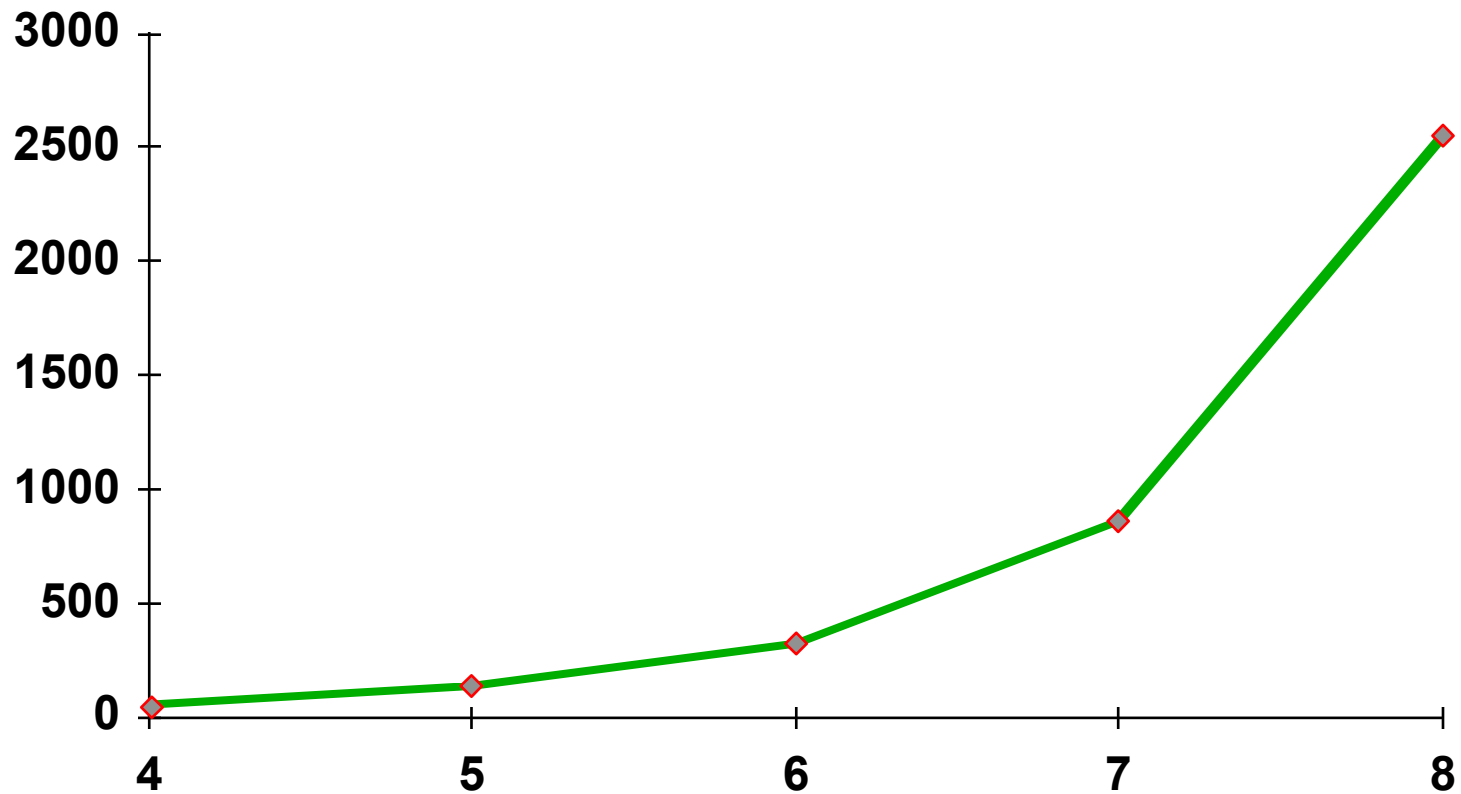
# Chronological Search: Assumptions Explored



# Dependency Directed Search: Time used

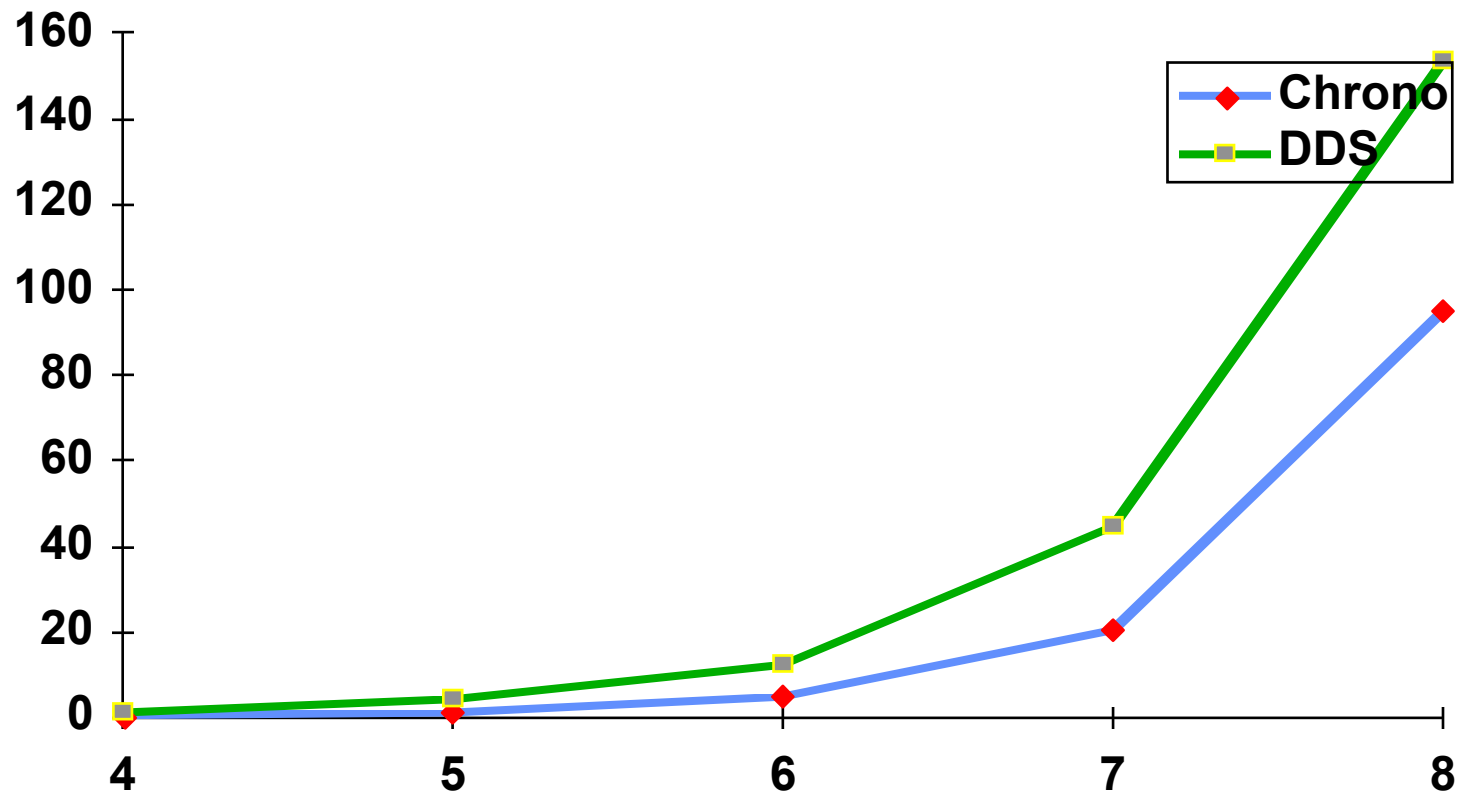


# Dependency-Directed Search: Assumptions Explored

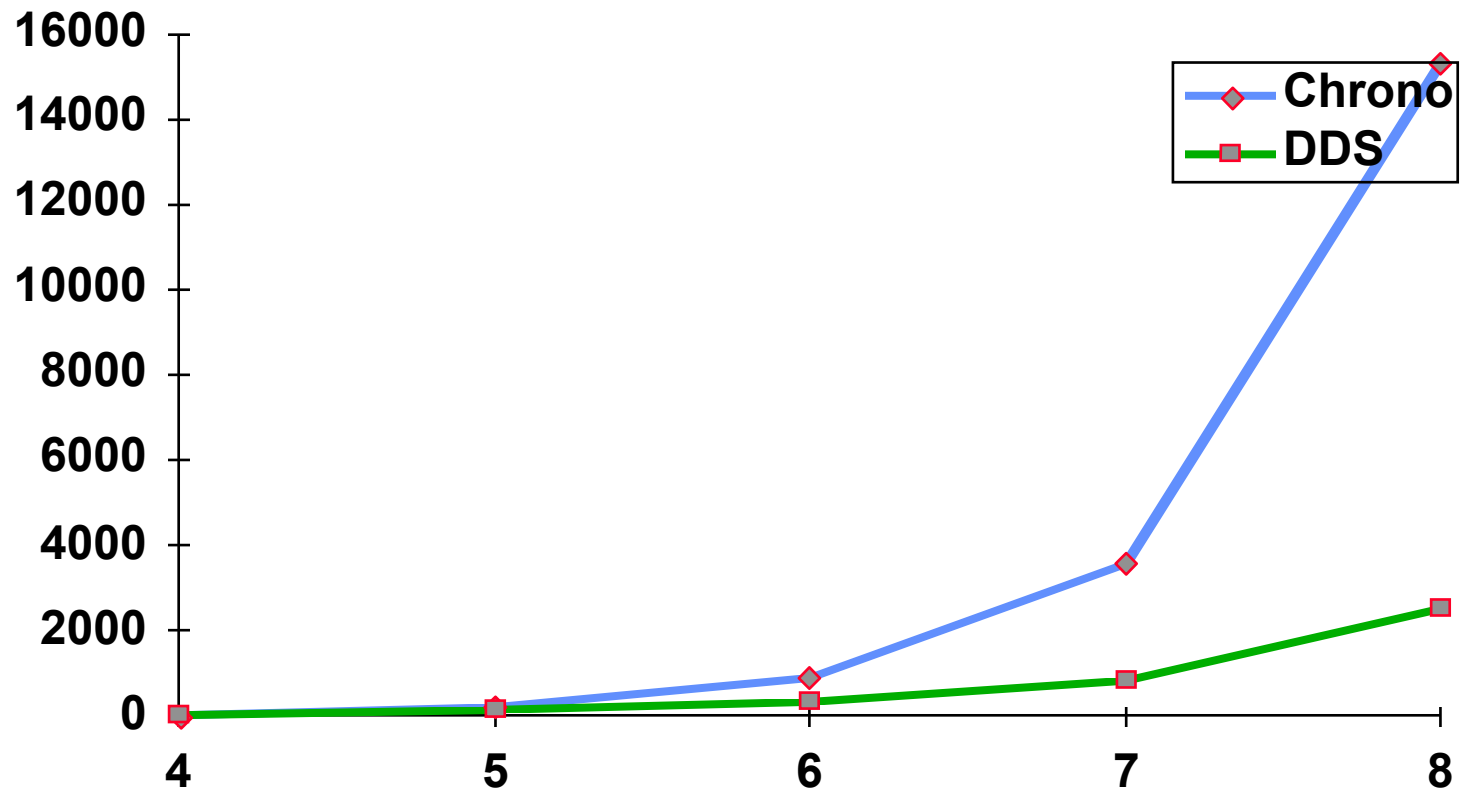


# Comparing the results

## Time in seconds



# Comparing the results Assumptions Explored



# Implications

- **Neither strategy changes the exponential nature of the problem**
- **Dependency-directed search requires extra overhead per state explored**
- **The overhead of dependency-directed search pays off on large problems when the cost of exploring a set of assumptions is high**

# **Using a TMS in problem solving**

**Case study: JSAIN**



# JSAINT: Its task

- **Input:** An indefinite integration problem
- **Output:** An expression representing the answer

$$\int [4e^{2x} + 3.2 \sin(1.7x) + 0.63] dx$$

JSAINT returns

$$2e^{2x} - 1.88 \cos(1.7x) + 0.63x$$

# Issues in JSAIN design

- **Explicit representation of control knowledge**
- **Suggestions Architecture**
- **Special-purpose higher-level languages**
- **Explanation generation**

# Issue 1: Explicit representation of control knowledge

- The use of show assertions in KM\* is only the beginning!
- Recording control decisions as assertions enables
  - Control knowledge to be expressed via rules
  - keeping track of what is still interesting via the TMS
  - Explaining control decisions
  - Provides grist for debugging and learning
- Key part of JSAINT design is a *control vocabulary*

## Issue 2: Control via suggestions

- **Problem: Local methods cannot detect loops, combinatorial explosions**
- **Solution: Decompose problem-solving operations into two kinds:**
  - Local operations for “obvious” tasks, making relevant suggestions
  - Global operations for choosing what to do
- ***Suggestions Architecture* is a very useful way to organize problem solvers**

## Issue 3: Special-purpose higher-level languages

- **Problem: Rules still too low-level for many purposes.**
- **Solution: Design special-purpose language to meet domain experts half-way**

```
(defIntegration Move-Constant-Outside
  (Integral (* ?const ?nonconst) ?var)
  :test (and (not (occurs-in? ?var
                           ?const))
             (occurs-in? ?var ?nonconst))
  :subproblems ((?int
                 (Integrate
                  (Integral ?nonconst ?var))))
  :result (* ?const ?int))
```

# **Issue 4: Explanation generation**

- **Want to know how a solution was obtained**
  - Dependencies involving the data provide this
- **Want to know what went wrong when JSAINT can't solve the problem**
  - Dependencies involving the control assertions provide this

# How SAINT Worked

- 1. Is problem a standard form?  
If so, substitute & return answer**
- 2. Find potentially applicable transformations.  
For each transformation, create the  
subproblem of solving the transformed  
problem.**
  - SAINT used 26 standard forms, 18  
transformations**
  - Also used many special-purpose procedures**

# Knowledge about Integration

- **Standard forms**

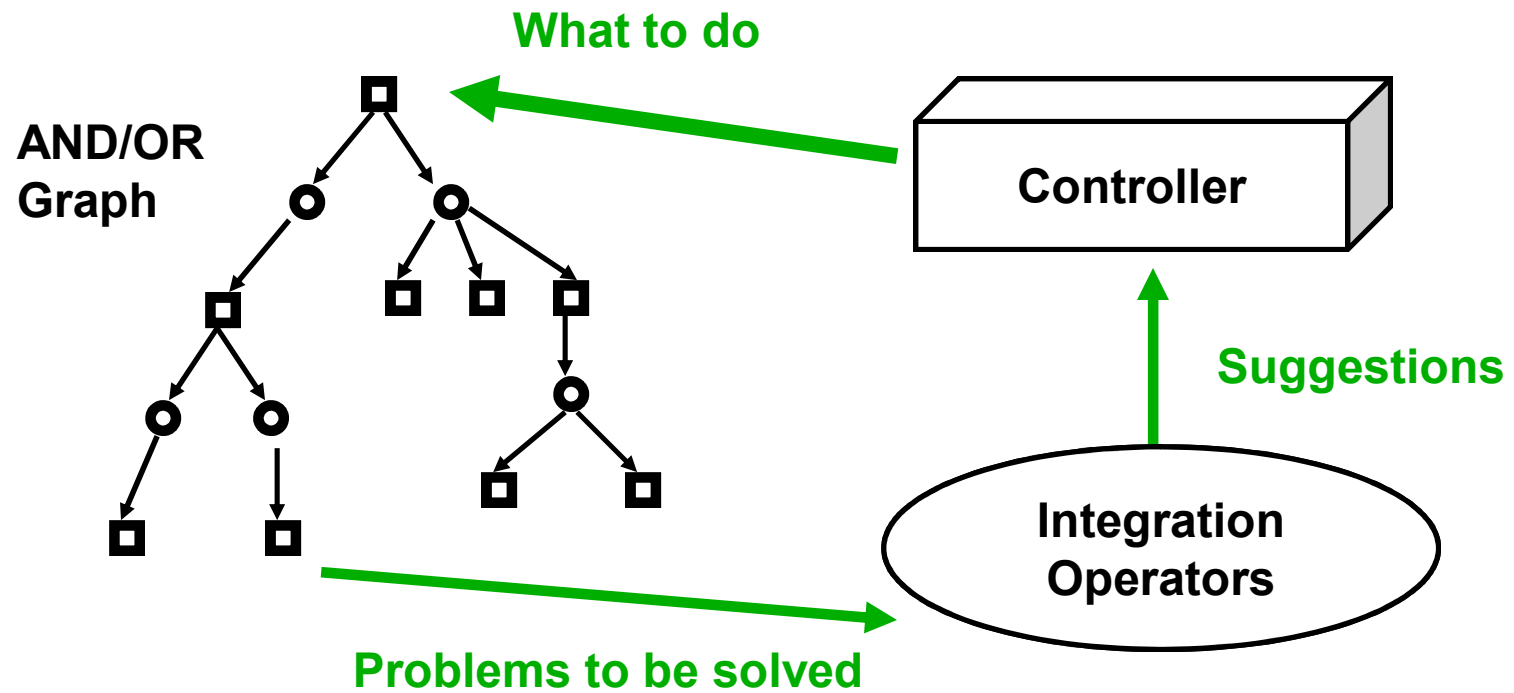
$$\int v dv \rightarrow \frac{1}{2} v^2$$

- **Transformations**

$$\int c g(v) dv \rightarrow c \int g(v) dv$$



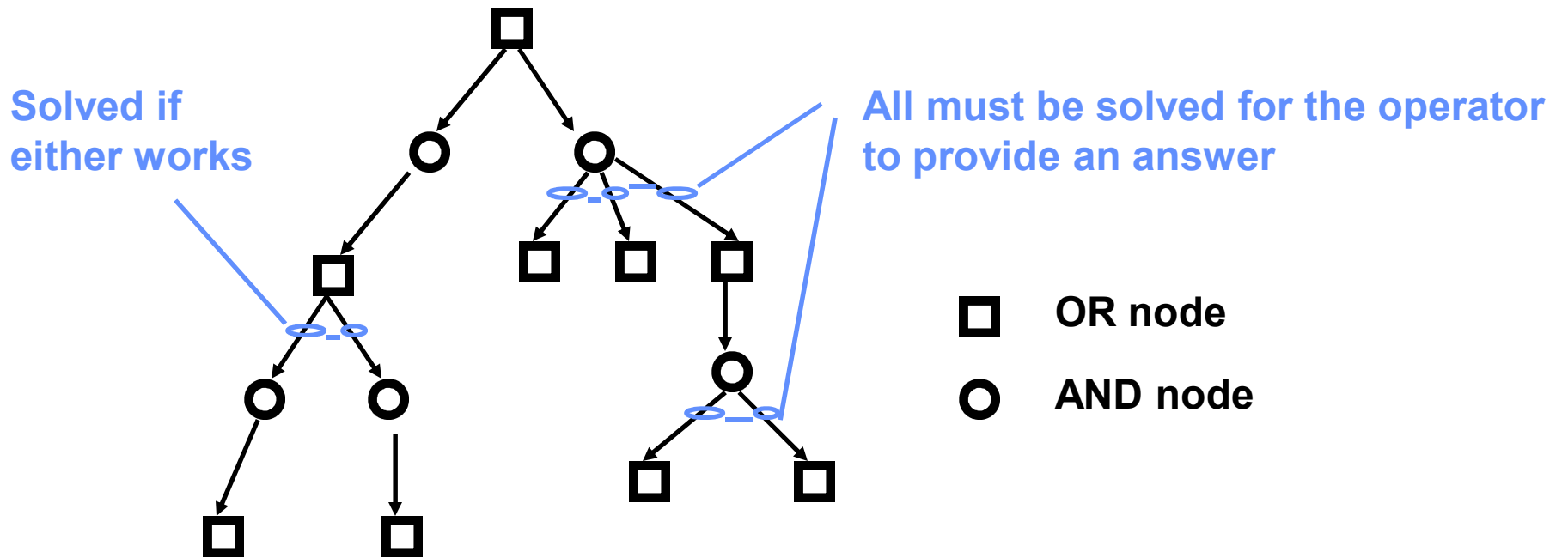
# JSAINT Architecture



# Central Controller

- **Gathers suggestions about particular subproblems**
- **Selects what subproblem to work on next**
- **Ensures that resource limits aren't exceeded**

# AND/OR Trees



# **AND/OR Graph**

- **Maintains status of work on problems and subproblems**
- **Detects when problems are solved**
- **Detects when problems cannot be solved**

# Integration Operators

- Provide direct solutions to simple problems (analogously to SAINT's *standard forms* )
- Suggests ways of decomposing problems into simpler problems

# **JSAINT in operation**

- 1. If original problem has been solved, or clearly cannot be solved, or if resource bounds have been reached, quit.**
- 2. Select best subproblem  $P$  to work on.**
- 3. If  $P$  can be directly solved, do it.**
- 4. Otherwise, gather suggestions for how to solve  $P$  and extend the AND/OR graph accordingly.**

# Representations

- **Mathematics is the easy part**

$$\int (x + 5)dx$$

**is represented as**

`(integral (+ x 5) x)`

- **Representing control knowledge is harder**

# How detailed?

- **Implicit**  
`(integral (+ x 5) x)`
- **Make operations to perform explicit**  
`(integrate (integral (+ x 5) x))`
- **Make nature of goal explicit**  
`(solve  
 (integrate (integral (+ x 5) x)))`
- **Make nature of activity explicit**  
`(do (solve  
 (integrate  
 (integral (+ x 5) x))))`



# Tradeoffs

- **Implicit often means fast & simple**
  - Fewer assertions means less storage, fewer justifications
  - Avoid hunting polar bears in the desert
- **Explicit often means flexible & maintainable**
  - Recording decisions in dependency network makes them available to both the program and its users
  - Avoid killing dead bears

# JSAINT Decisions

- Won't explicitly represent goal versus problem versus task distinction
- Only kind of goal: TRY  
`(TRY (integral-of-sum  
 (integral (+ x 5) x)))`

# Success or failure of problems

**(solved  $\langle P \rangle$ ) is believed exactly when problem  $P$  has been solved**

**(failed  $\langle P \rangle$ ) is believed exactly when  $P$  cannot be solved by JSAIN'T given what it knows.**

**(solution-of  $\langle P \rangle$   $\langle A \rangle$ ) holds exactly when  $A$  is the result of solving problem  $P$**

# Representing Goals

- **JSAINT uses the form of the goal itself**  
`(integrate (integral (+ x 5) x))`
- **Advantage: Easy to recognize recurring subproblems**
  - Actually an AND/OR graph rather than an AND/OR tree
- **Alternative: Reify goals**  
`(goal GOAL86)  
(GOAL86 form-of  
  (try (risch-algorithm  
      (integrate  
      (integral CENSORED )))))`

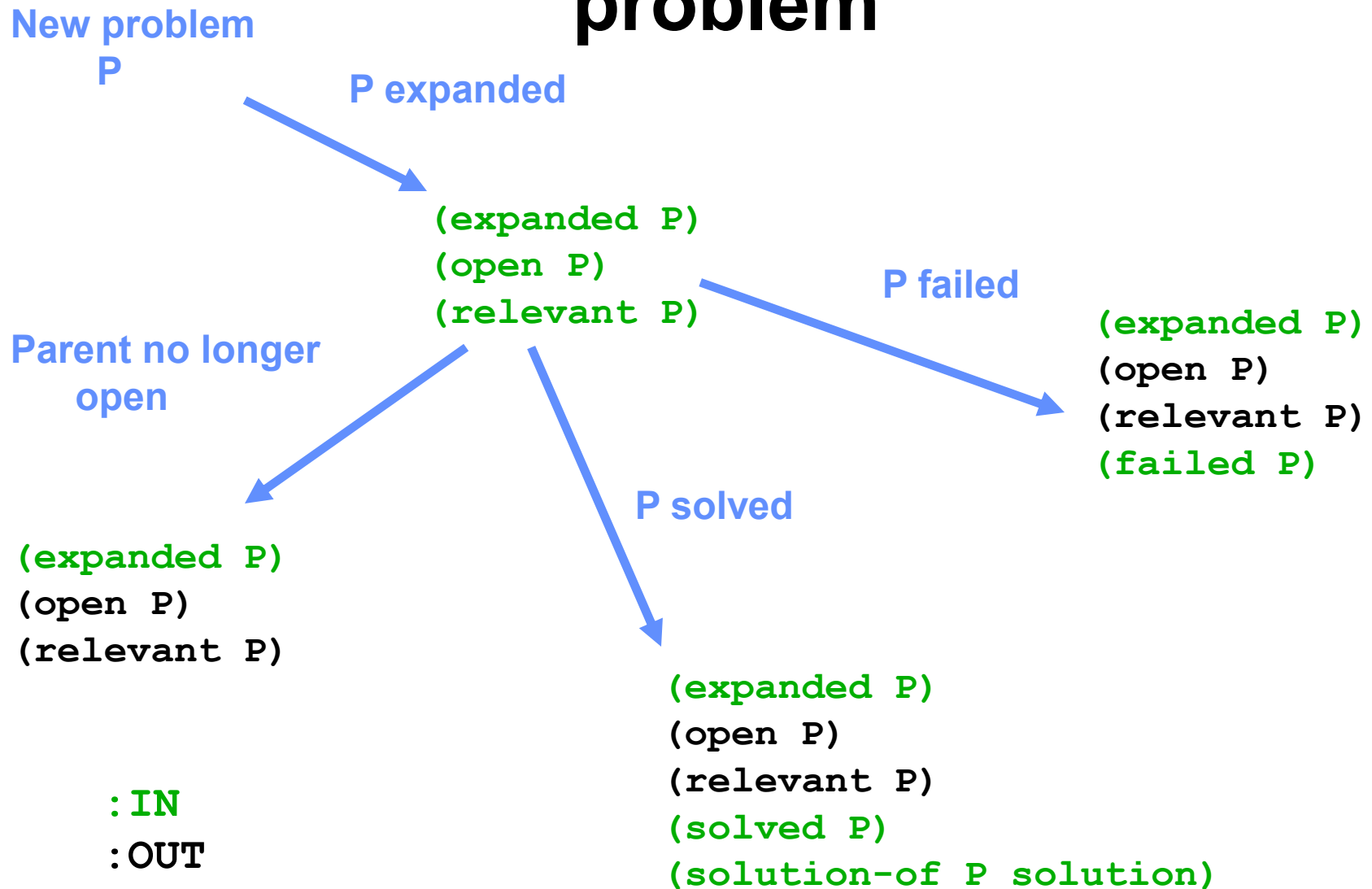
# Representing progress

**(expanded P) is believed exactly when work has begun on P**

**(open P) is believed exactly when P has been expanded but is not yet solved or known to be unsolvable.**

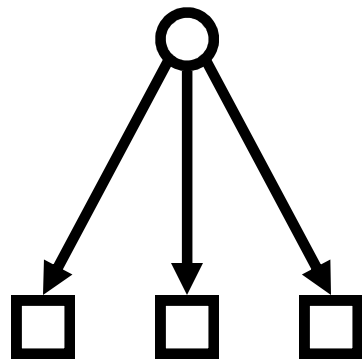
**(relevant P) is believed exactly when P is still potentially relevant to solving the original problem.**

# The natural history of a problem



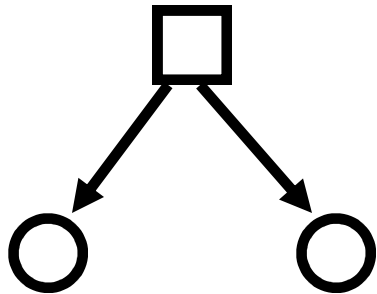
# Semantics of success and failure for AND nodes

- Failure of single child means failure of parent
- Success of all children means success of parent



# Semantics of success and failure for OR nodes

- Failure of all children means failure of parent
- Success of any child means success of parent





# **Closed-World assumptions in JSAINT**

- **Implicit in structure of system**
  1. **All possible relevant suggestions are available when a problem is first posed.**
  2. **Every operator succeeds if its conjunctive subgoals succeeds**
- **However: Any node can gain parents at any time.**

# Design issues for operators

- **An operator must**
  - look for relevant problems
  - make suggestions when it finds them
  - apply itself when selected by the controller
  - justify an answer when it succeeds
- **This requires using the control vocabulary in a reasonable protocol**

# A typical operator

```
(defIntegration Integral-of-Sum
  (integral (+ ?t1 ?t2) ?var)
  :SUBPROBLEMS
    ((?int1 (integrate
             (integral ?t1 ?var)))
      (?int2 (integrate
             (integral ?t2 ?var))))
  :RESULT (+ ?int1 ?int2))
```

# Looking for relevant problems

- Look for expanded assertions that match

`(expanded (integrate (+ x y) x))`

# Making suggestions

- Happens antecedently

```
(suggest-for  
  (integrate (integral (+ x y) x))  
  (integral-of-sum  
    (integral (+ x y) x)))
```

# Controller communicates its wishes

- Operator spawns rule that looks for the signal to start working:

(expanded

```
(try (integral-of-sum  
      (integral (+ x y) x))))
```

# How the Controller Works

- 1. Check the original problem**  
**If solved, then halt & report success**  
**If failed, then halt & report failure**
- 2. If agenda is empty, halt & report failure**
- 3. If resource allocation exceeded, halt & report failure**
- 4. Select simplest subproblem on the agenda and work on it**
- 5. Return to Step 1**

# The Agenda

- **Unlike TRE queues, not everything will be executed.**
- **Items on the agenda consist of**
  - A subproblem
  - An estimate of its difficulty
- **Difficulty estimates depend only on the structure of the problem, not its history**



# Working on a subproblem

1. Assert **EXPANDED** and assume **OPEN**
2. Run **JTRE** queues to completion
3. If **SOLUTION-OF** found, then finish.
4. Fetch all suggestions for the problem
5. If no suggestions, mark **FAILED**.
6. Otherwise, install **TRY** assertions as **OR** children of the problem