

# Parallel evaluation of logic programs

## Intelligent Backtracking in AND/OR process model

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## Parallel Evaluation of Logic Programs

- Logic program
- AND/OR proof tree
- AND/OR process model
- OR parallelism and AND parallelism
- Intelligent backtracking(AND parallelism)
- Implementation
- Research Topics

# Logic Programs

- Logic programs(Horn clauses)  
Disjunction(OR) of **predicates**(literals)  
with **at most one** un-negated literal
- $\neg p_1 \vee \dots \vee \neg p_n \vee p$   
 $\equiv \neg(p_1 \wedge \dots \wedge p_n) \vee p$   
 $\equiv (p_1 \wedge \dots \wedge p_n) \Rightarrow p$       **implication**
- $p$  is true, if  $p_1$  and  $p_2$  and ... and  $p_n$  are true,  
 $p$  is either true or false, otherwise.
- Logic says **nothing** when hypothesis is **false**.

# Logic program(Prolog)

- $h \Leftarrow b_1 \wedge \dots \wedge b_n .$   
 $h$ : **head** literal  
 $b_1, \dots, b_n$ : **body** literals
- Four cases (clause)
  1.  $\Leftarrow b_1 \wedge \dots \wedge b_n ?$       **query** clause
  2.  $h \Leftarrow b_1 \wedge \dots \wedge b_n .$       **rule** clause
  3.  $h .$       **fact** clause
  4.  $.$       tautology(X)

Logic program

A **query** and a set of **rules** and **facts**

**Relational database**

## Syntax of Logic program(Prolog)

- Clause

query clause

$\Leftarrow$  body literals ?

rule clause

head literal  $\Leftarrow$  body literals .

fact clause

head literal .

- Literal

predicate ( terms )

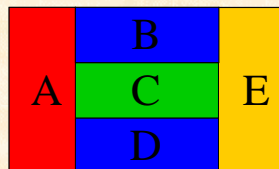
- Term

constant

variable

**literal**

## Example(map coloring problem)



$\Leftarrow$  color(A, B, C, D, E) ?

color(A, B, C, D, E)  $\Leftarrow$  diff(A, B), diff(A, C), diff(A, D), diff(B, C),  
diff(B, E), diff(C, D), diff(C, E), diff(D, E)

diff(X, Y)  $\Leftarrow$  diff1(X, Y) | diff1(Y, X)

diff1(red, blue). diff1(red, green). diff1(red, yellow) .

diff1(blue, green). diff1(blue, yellow) . diff1(green, yellow) .

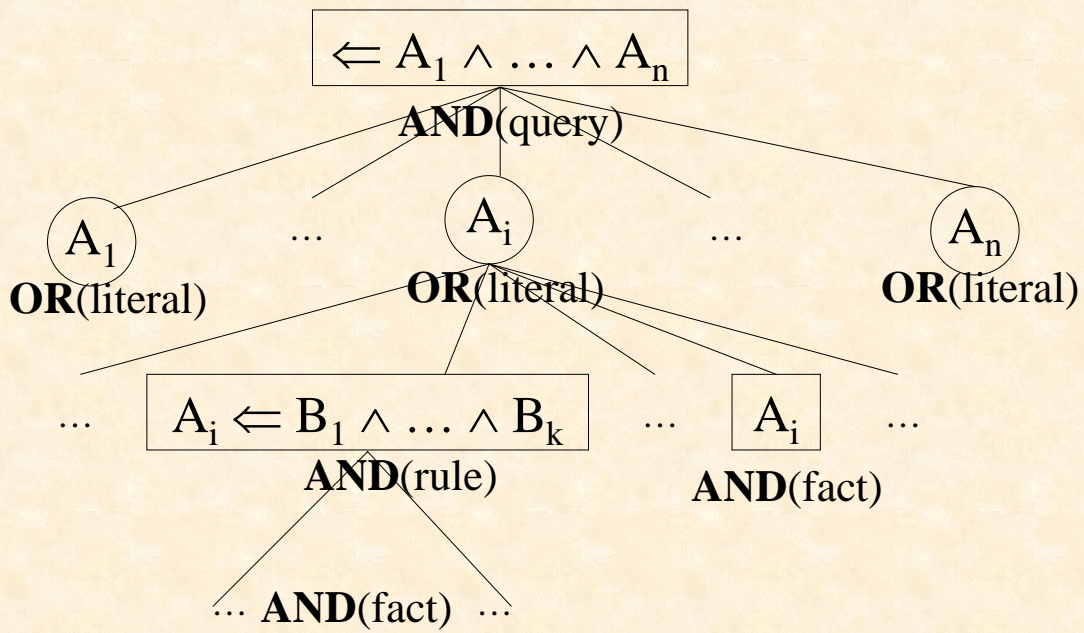
## Top down evaluation of logic programs

- query clause(AND)
    - body literals(OR)
      - rule clauses(AND)
        - body literals(OR)      **recursion**
        - rule clauses(AND)    **recursion**
        - ...
        - fact clauses(AND)      **basis**
- $Q - L - R - L - \dots - R - L - F.$   
 $Q - L - (R - L)^* - F.$

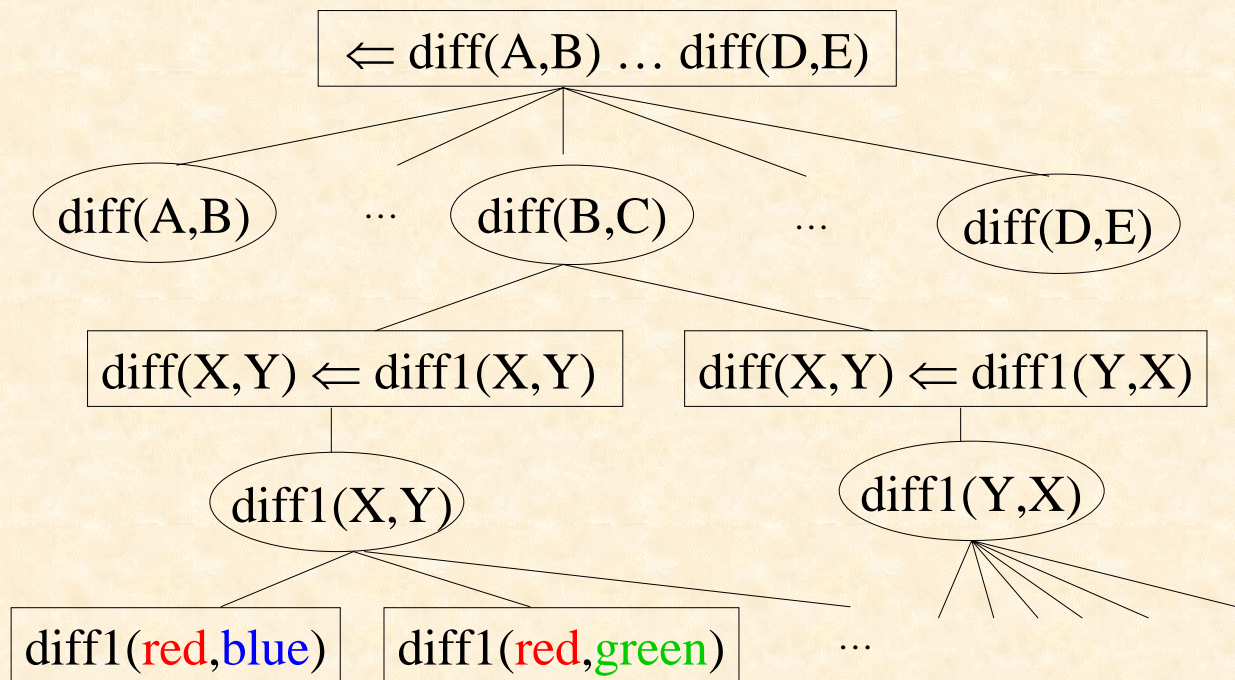
## AND/OR proof tree

- AND/OR proof tree
  - clause and literals
  - interlaced graph
- Clause(AND)
  - AND logic among children body literals, if any
- Literal(OR)
  - OR logic among children clauses with **same head**
- AND node      Clause(query, rule, fact)
- OR node      Literal
- $Q - L - (R - L)^* - F.$
- $A - O - (A - O)^* - A.$

## AND/OR proof tree(2)



## Example(AND/OR proof tree)



## Parallel evaluation of programs

- **Parallelizing compiler**
  - Find the parallelism in the programs
  - Difficult, parallelisms may be lost!
  - Array index(integer linear programming)
- **Writing parallel programs**
  - concurrent, parallel algorithm
  - mathematically well defined problems
  - Fourier transformation
- **Inherited parallelism**
  - Logic(natural parallelism)

## Parallel evaluation of logic programs

- J. C. Conery, 1981 U. C. Irvine
  - AND/OR proof tree    AND/OR process tree
  - AND node(clause)      AND process
  - OR node(literal)      OR process
- **AND process(clause)**
  - parallel AND among **children OR processes**
- **OR process(literal)**
  - parallel OR among **children AND processes**

## Messages between AND/OR processes

- 1. create** parent process → child process
  - **Start** evaluation and give me a **solution**.
- 2. success  $\theta$**  child process → parent process
  - **Yes**,  $\theta$  is the **solution**.
- 3. fail** child process → parent process
  - **No**, I do **not** have **solution** any more.
- 4. cancel** parent process → child process
  - **Stop** evaluation.
- 5. redo** parent process → child process
  - Give me the **next** solution.
- 6. reset** parent AND proc. → child OR proc.
  - Give me the **first** solution. (???)

## OR parallelism(1)

- 1. create** message from parent AND process
  - **Create** all of its children AND processes.
  - Stay in wait mode.
- 2. success  $\theta$**  message from child AND process
  - Store  $\theta$  in the solution list.
  - Send **redo** to the child AND process.
  - If in wait mode, send **success  $\theta$**  to the parent, mark the **first** solution as  $\theta$ , and change to gathering mode.

## OR parallelism(2)

3. **fail** message from child AND process
  - **Cancel** the child AND process.
  - If **no more** children AND processes,  
    **empty** solution list, and in wait mode,  
    report **fail** to its parent AND process.
4. **cancel** message from parent AND process
  - **Cancel all** of its children AND processes.

## OR parallelism(3)

5. **redo** message from parent AND process  
(in gathering mode only)
  - If there is a **next** solution  $\theta$  in the solution list,  
    send **success**  $\theta$  to the parent.
  - Else change to wait mode, and  
    if no more children, report **fail** to parent.
6. **reset** message from parent AND process
  - Restore solution list.
  - If the first solution is  $\theta$ ,  
    send **success**  $\theta$  to the parent.



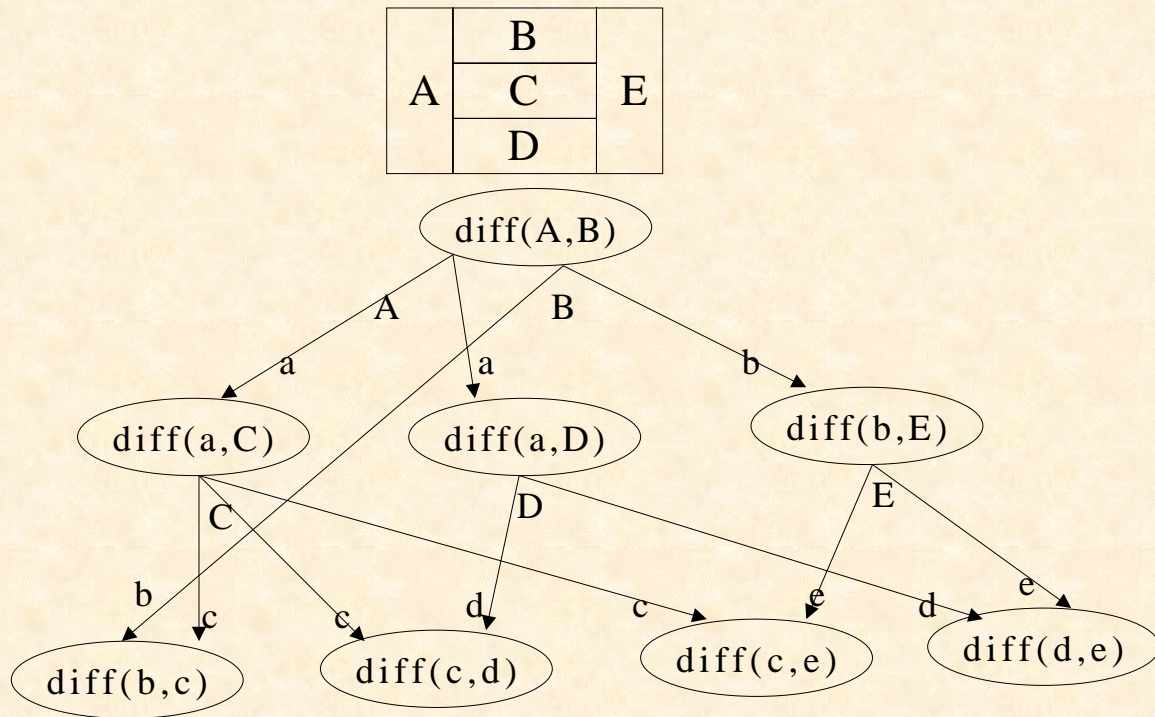
## AND parallelism

- **Shared variables** among body literals
  - Variable **binding**
- **Join** scheme
  - Generate **all** of the tuples, and **check** binding
  - Fully **parallel** but **inefficient**
- **Forward** scheme
  - **One** literal **generates**(binds) a constant  
the **other literals consumes** the constant
  - **Generator and consumers model**
  - Parallel in **sequence** but **efficient**

## Data dependency graph

- Selection of the among **shared** literals  
**nondeterministic**  
**parallel**
- Data dependency graph  
**generator** and **consumers** relationships  
for each **shared** variable  
**single generator and multiple consumers**  
the graph may be **dynamic**

## Data dependency graph(example)



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## Forward and backward execution

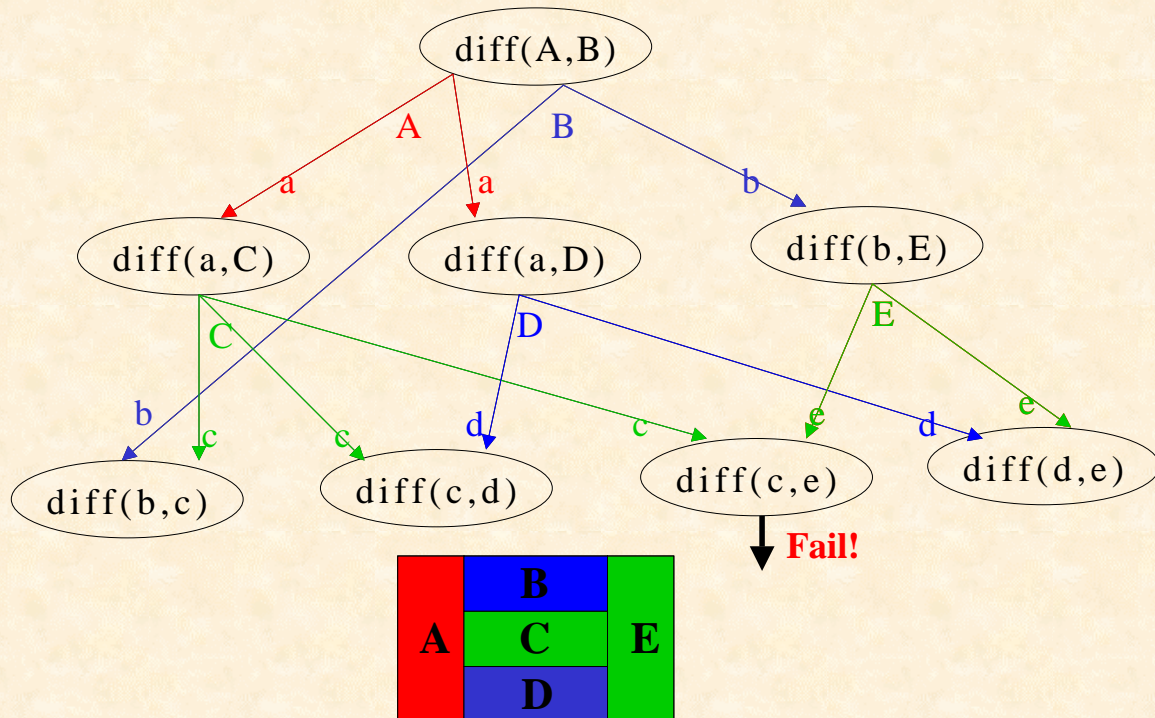
- **Forward execution**  
**create OR processes parallel in sequence**  
 $\text{diff}(A, B) - (\text{diff}(a, C), \text{diff}(a, D), \text{diff}(b, E)) - ???$   
**All of the children OR processes success,**  
**report success, to its parent OR process**
- **Backward execution**  
 a child OR process report **fail**  
 next binding should be **generated**  
**systematically(generator)**  
**exhaustive and intelligent**

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# Data dependency graph(forward execution)



## Nested loop model

- for A in colors                    for (A, ... ,E) in colors<sup>5</sup>  
    for B in colors
- ...
- for E in colors  
            if  $\text{diff}(A, B)$  and ... and  $\text{diff}(D, E)$  then ...
- for (A, B) in colors<sup>2</sup> where  $\text{diff}(A, B)$   
    for C in colors where  $\text{diff}(a, C)$   
        for D in colors where  $\text{diff}(a, D)$   
            for E in colors where  $\text{diff}(b, E)$   
                if  $\text{diff}(b, c)$   $\text{diff}(c, d)$ ,  $\text{diff}(c, e)$   $\text{diff}(d, e)$  then ...

## Intelligent backtracking

For (A, B) in color<sup>2</sup> **where** diff(A, B) do  
  for C in color **where** diff(a, C) do  
    for D in color **where** diff(a, D) do  
      for E in color **where** diff(b, E) do  
        if diff(b, c) and ... and diff(d, e) then ...

When diff(b, c) fails

**naive** backtracking(in nested loop model)

diff(b, E) → diff(a, D) → diff(a, C) → diff(A, B)

**intelligent** backtracking

diff(a, C) → diff(A, B)

## Backward execution

- **Nested loop model**
  - outer** loop variable with next constant(**redo**)
  - variables **inner** loop with the **first** value(**reset**)
- **Intelligent backtracking**
  - a child OR process report **fail**
  - the OR process can not find any solutions
    - with the **binding(given by generator)**
  - generator** should give **new binding(redo)**
  - generators in inner loop**
    - restart with the **first binding(reset)**

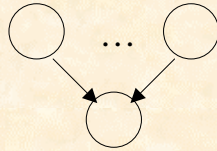
## Lineally ordered literal list(LOLL)

- **Linear**(total) order among **generator** literals(variables)  
next(A, B) → next(a, C) → next(a, D) → next(b, E)  
(A, B) → C → D → E
- No dependency relation among C, D, and E.  
But there must be an artificial **linear** order for **systematic** backtracking(**reset**, the **first** solution)
- When next(a, **C**) is **redone**  
next(b, **c**), next(**c**, d), next(**c**, e) **cancelled**(consumer)  
next(a, **D**), next(b, **E**) **reset**(inner loop)  
next(**d**, **e**) **cancelled**(cons)

## Intelligent backtracking

1. **Failure** is reported by a literal  $L_f$ .
  2. Find a **proper** literal  $L_b$  to be **redone**.
  3. **Reset all** of the **generator** literals  
whose order is later than  $L_b$  in LOLL.
  4. **Cancel** messages to **all** of the **consumer** literals  
of **redone**, **reset**, and **canceled** literals
- Tuple generation model vs nested loop model

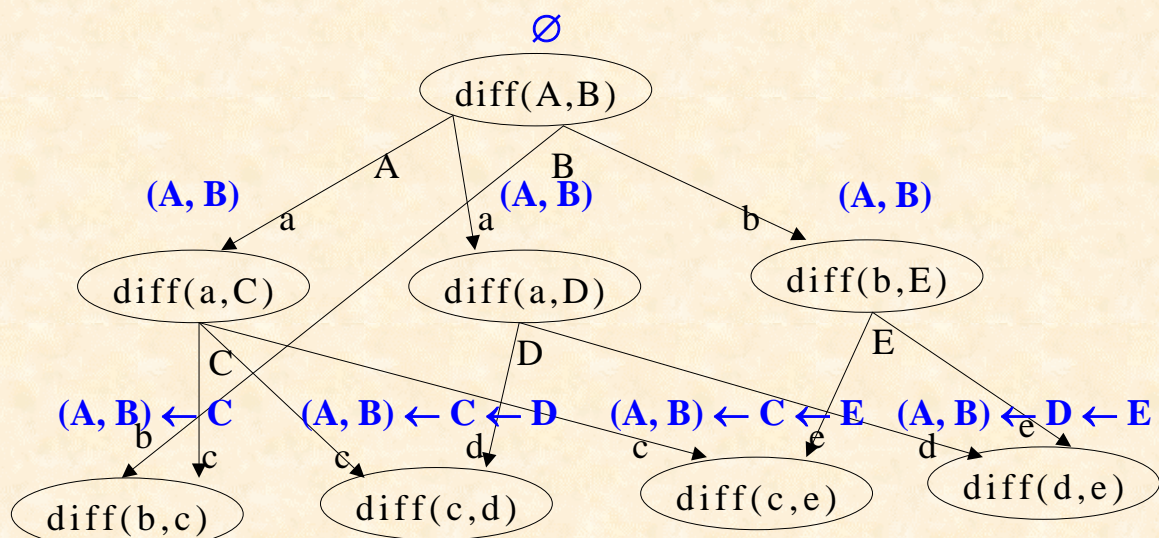
## Cause of consecutive failures



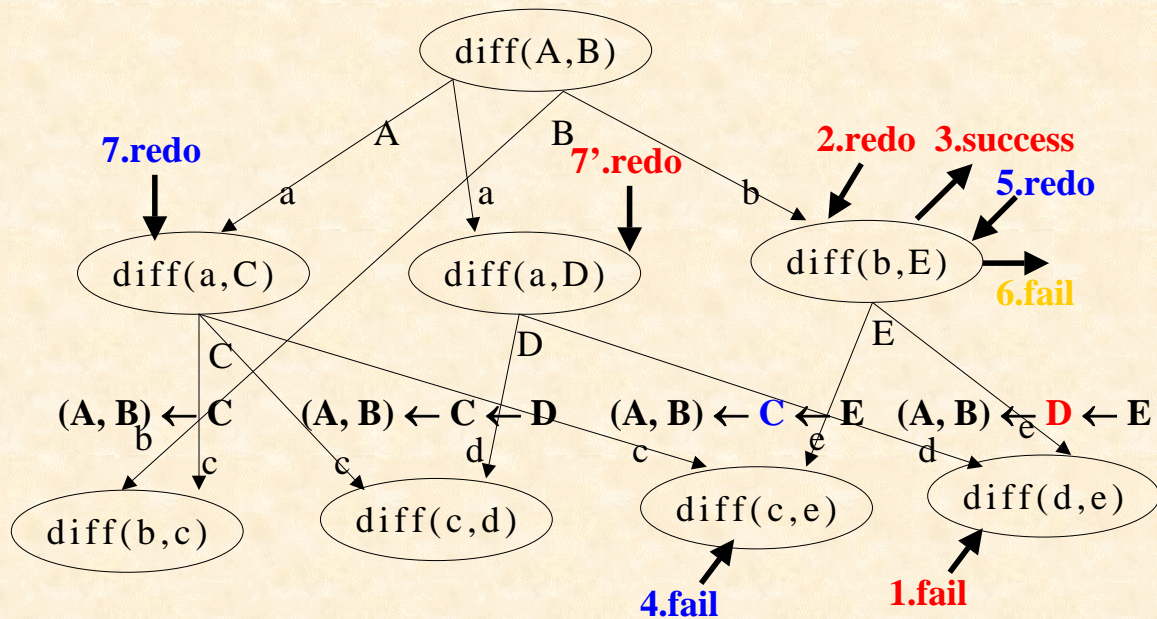
- If failed literal consumes more than one variable, the **last generator** in LOLL is **redone**
- If the last generator **fails** again the **remaining generators** of failed literals should be **redone** again.
- The **remaining generators** should be **stored** to consider the **other failures**.  
**multiple failure**

## Conery's model

- Consecutive failure  
**redo list** for each literal(**static**)
- A **sequence of the last generators** of the literal



## Improper redo – multiple failures



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## Redo Cause Set(RCS)

- Remaining **generators** for each generator they must be redone if **this** generator **fails again**  
type 2 backtracking in Conery
- **Multiple failure**
- remaining generators are added to RCS of the **redone** generator  
When the failed literal report **success**  
RCS of the **redone** generator is **updated**
- Lin, Kumar, and Lung in U. Texas  
B-list

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## Implementation

- Prolog **parallel evaluator**
- **Front end**  
prolog program → internal representation(AST)
- **Back end**  
AST → creation of AND/OR processes  
written in **concurrent C**
- process management  
AND process  
OR process

## Load Balancing

- **Dynamically** glowing tree  
static processor configuration
- number of processes  $\gg$  number of processors
- **load balancing vs hop count**  
local optimization  
hop count = 1
- mesh or cube  
recursively circulant graph  
performance analysis



## Research topics

- **Forest model**(이명준)
  - affection relation
  - multiple resetting
  - parallel backtracking
- **Unified model**(김도형)
  - Full solution level selective resetting
- **Algebraic model**(이수현)
  - Calculus of Communicating System(CCS)
  - Parallel model

## Conclusion

- Parallel evaluation of logic programs
- **Intelligent backtracking**

그리고,

學而之銘名

名可名, 非常名

자연과학, 공학

인문, 사회과학

서양

동양

**Evolution**

**Revolution**

教

禪

끊임없는 노력

한 순간에 오는 깨달음