

Cumulating Search  
in a  
Distributed  
Computing Environment

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# Outline

- Introduction
- Satisfiability:  
Davis - Putnam  
SATO
- Parallel satisfiability:  
PSATO
- Experiments
- Problems on quasigroups
- Discussion

# Satisfiability

S: set of propositional clauses



- Davis Putnam algorithm 1960
- NP-completeness, Cook 1971

# Satisfiability

Recent work:

- Sequential SAT:

[Zhang 1993] SATO

[Zhang, Stickel 1994]

[McCune 1994] ANL-DP

...

- Parallel / distributed SAT:

[Böhm, Speckemeyer 1994]

[Zhang 1994] PSATO

...

# Motivation

- SAT

- Constraint satisfaction problems

on  
finite  
domains  $\implies$  SAT  
problems

- Model generation

[Slaney 1992] FINDER

- Algebraic problems

Quasigroups problems

[J. Zhang 1990]

[Fujita, Slaney, Bennett 1993]

...

# Motivation

Problems in distributed deduction:

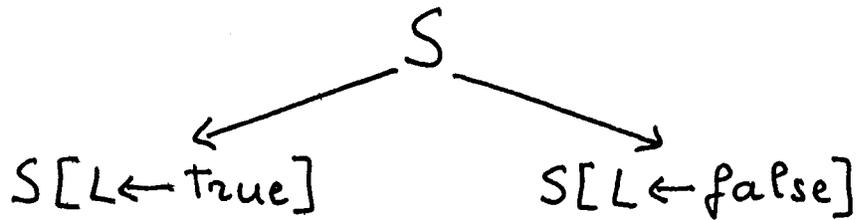
- Partition the search space among parallel processes
- Combine the work of parallel processes
- Cumulate the results of searches performed in separate intervals of time
- Scalability
- Fault-tolerance

PSATO: a parallel SAT prover

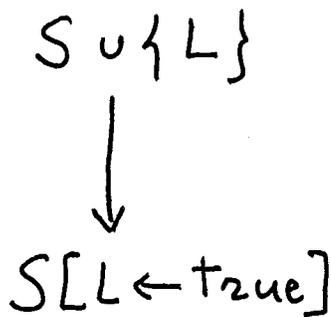
- concurrent asynchronous SAT processes
- one process on each node of a network of workstations
- partition search space  
no overlap
- cumulate search by concurrent processes
- cumulate search over time
- highly scalable
- fault - tolerant

# The Davis - Putnam algorithm

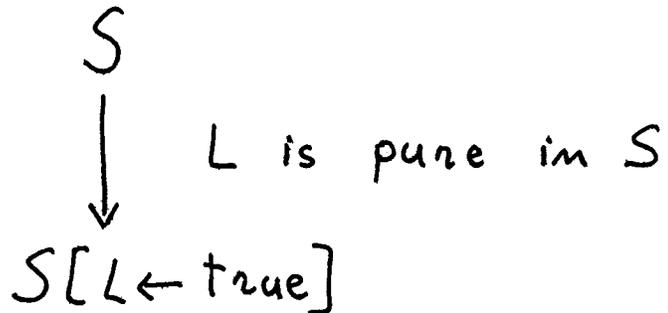
- case splitting



- unit clause rule

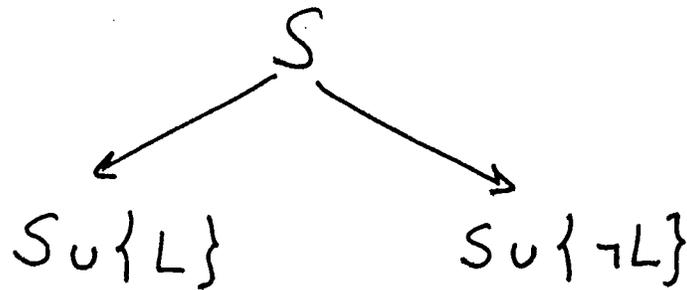


- pure literal rule



# SATO

- case splitting



- unit clause rule

- unit subsumption
  - unit resolution
- } unit propagation

# SATO

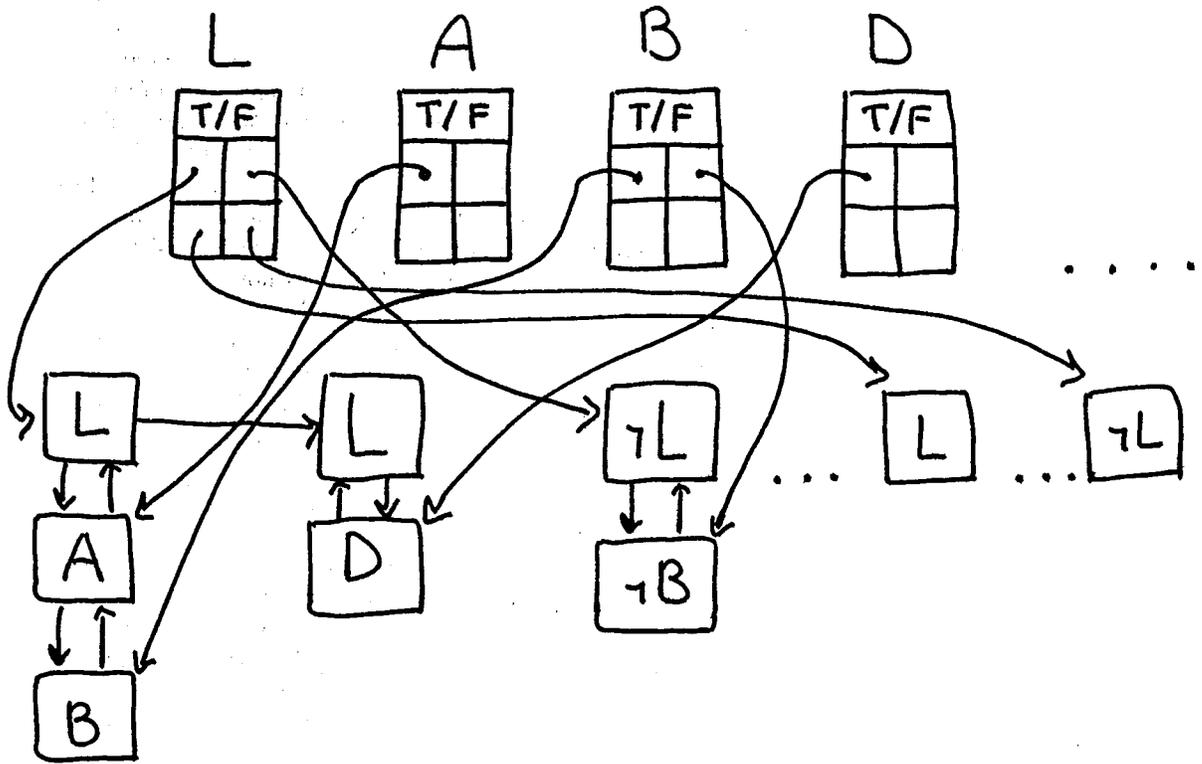
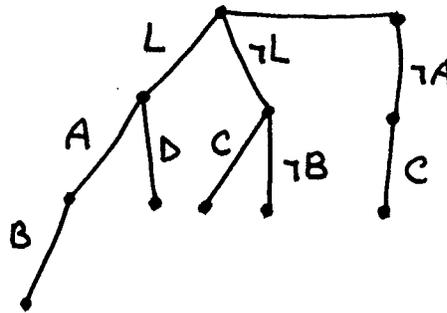
- Trie data structure  
(discrimination trees)  
for representing clauses.
- Trie-based sublinear algorithm  
for unit-propagation  
[Zhang, Stickele 1994]
- Heuristic for splitting:  
choose a literal in one  
of the shortest positive clauses.

# Tries in SATO

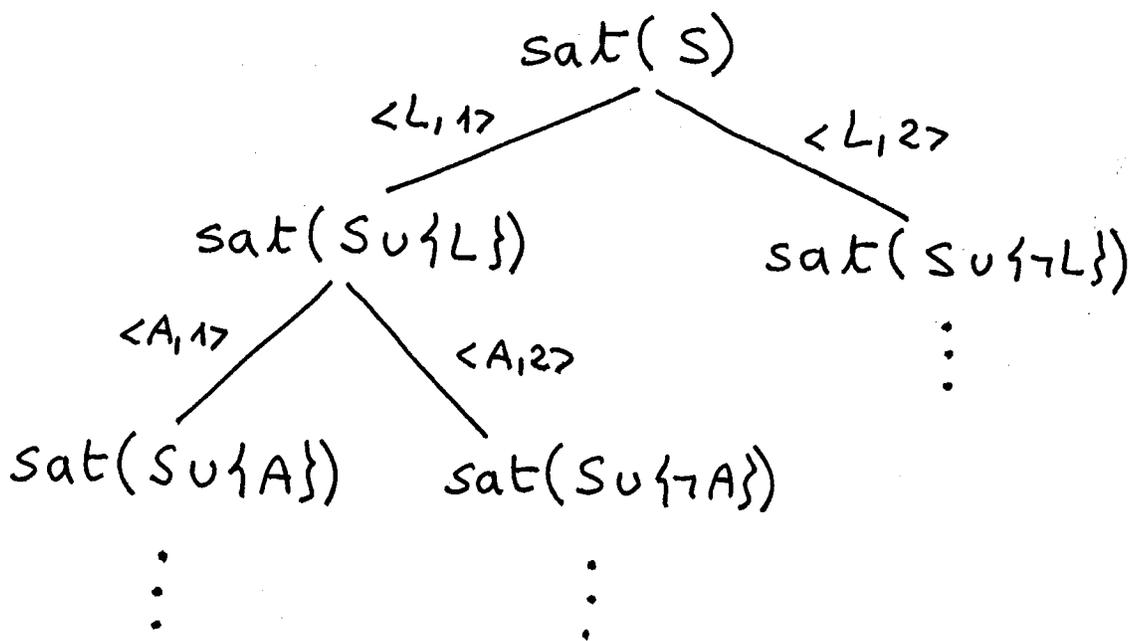
Trie for L :

$\langle L, T_L, T_{\neg L}, T_0 \rangle$

- L v A v B
- L v D
- $\neg L$  v  $\neg B$
- $\neg A$  v C
- $\neg L$  v C



# Cumulating search over time



guiding path :  $(\langle L,1 \rangle, \langle A,2 \rangle, \dots)$

⋮ "open"      ⋮ "closed"

$\text{sat}(S, \emptyset)$

halt at node  $x$

save guiding path  $P$  from root to  $x$

$\text{sat}(S, P)$

# PSATO

Master / Slave organization:

The master:

- partition the search space  
among the slaves,
- broadcast
  - choice of splitting rule,
  - allotted time,
  - halting message ....
- receive reports.

Each slave executes the

Davis - Putnam algorithm (SATO).

## Partition the search space

The master assigns to each slave:

- the set of input clauses,
- a different guiding path.

Different guiding paths lead the search to disjoint portions of the search space.

$$P = (\langle L_{1,2} \rangle \dots \langle \underline{L_{i,1}} \rangle \dots \langle L_{k,\delta_k} \rangle)$$

is splitted into

$$P_1 = (\langle L_{1,2} \rangle \dots \langle \underline{\neg L_{i,2}} \rangle)$$

$$P_2 = (\langle L_{1,2} \rangle \dots \langle \underline{L_{i,2}} \rangle \dots \langle L_{k,\delta_k} \rangle)$$

# PSATO

The master handles a list of guiding paths to be assigned.

Each slave may report:

- true
- false
- out of time/memory with guiding path computed so far

$\exists$  guiding path returning true:  
satisfiable.

$\forall$  guiding paths return false:  
unsatisfiable.

# Experiments with PSATO

## on random 3-SAT

### unsatisfiable problems:

| #V  | #P | Wall<br>Clock | Total<br>Time | Speed-<br>up | Over-<br>head |
|-----|----|---------------|---------------|--------------|---------------|
| 100 | 1  | 22.2          | 22.2          | —            | —             |
|     | 5  | 7.9           | 24.4          | 2.81         | 0.10          |
|     | 20 | 3.6           | 26.0          | 6.17         | 0.17          |
| 150 | 1  | 1082.5        | 1082.5        | —            | —             |
|     | 5  | 237.9         | 1169.1        | 4.55         | 0.08          |
|     | 20 | 60.7          | 1212.4        | 17.83        | 0.12          |
| 200 | 1  | 53346.7       | 53346.7       | —            | —             |
|     | 5  | 10777.0       | 54947.1       | 4.95         | 0.05          |
|     | 20 | 2899.3        | 58793.4       | 18.40        | 0.07          |

#V : number of propositional variables

#P : number of processors

# Quasigroups

Groupoid :  $\langle S, * \rangle$

Cancellative :

$$x * u = y, x * w = y \implies u = w$$

$$u * x = y, w * x = y \implies u = w$$

$$x * y = u, x * y = w \implies u = w$$

Finite :  $S = \{0, \dots, v-1\}$

$$|S| = v \quad \text{order}$$

$$(x * y = 0) \vee \dots \vee (x * y = v-1)$$

$$(x * 0 = y) \vee \dots \vee (x * (v-1) = y)$$

$$(0 * x = y) \vee \dots \vee ((v-1) * x = y)$$

# Quasi group problems

[Fujita, Slaney, Bennett 1993]

| Name | Constraint   |
|------|--|
| QG1  | $x * y = u, z * w = u, v * y = x,$<br>$v * w = z \Rightarrow x = z, y = w$ |
| QG2  | $x * y = u, z * w = u, y * v = x,$<br>$w * v = z \Rightarrow x = z, y = w$ |
| QG3  | $(x * y) * (y * x) = x$  |
| QG4  | $(x * y) * (y * x) = y$  |
| QG5  | $((x * y) * x) * x = y$  |
| QG6  | $(x * y) * y = x * (x * y)$  |
| QG7  | $((x * y) * x) * y = x$  |

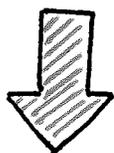
QG $i.v$  : basic axioms,  
i-th constraint,  
order  $v$  ( $S = \{0, \dots, v-1\}$ ),  
 $x * x = x$ .

## Quasigroup problems

Does there exist a quasigroup satisfying a specification  $QGi.v$ ?

Replace variables in  $QGi.v$  by values in  $S$ .

Replace  $x * y = z$  by  $P_{x,y,z}$ .



Satisfiability problem.

$O(v^k)$  clauses if  $QGi.v$  contains  $k$  variables.

# Quasi group problems

solved first by machine

Y: satisfiable

N: unsatisfiable

O: open

| $v$ : | 9 | 10 | 11 | 12 | 13 | 14 | 15 | 16 | 17 |
|-------|---|----|----|----|----|----|----|----|----|
| QG1   |   |    |    | O  |    |    |    |    |    |
| QG2   |   | O  |    | Y  |    | Y  | Y  |    |    |
| QG3   |   |    |    | Y  |    |    |    |    |    |
| QG4   |   |    |    | Y  |    |    |    |    |    |
| QG5   | N | N  | Y  | N  | N  | N  | N  | N  | O  |
| QG6   |   | N  | N  | N  |    | N  | N  |    | Y  |
| QG7   |   | N  | N  | N  |    | N  | N  |    |    |

Other open problems:

QG5.18, QG6.20, QG7.33.

# Performance of PSATO on hard unsatisfiable problems

| Prob.     | #P | Workdays | P-Measure |
|-----------|----|----------|-----------|
| QG5.14(*) | 20 | 35       | 11        |
| QG6.15    | 20 | 8        | 8         |
| QG7.15    | 20 | 5        | 6         |
| QG5.16    | 20 | 4        | 5         |
| QG6.17    | 8  | 2        | —         |

#P : number of processors

workday = 8 hours

(\*) : non-idempotent

P-Measure : number of open pairs in guiding path after one workday.

If p-measure =  $m$ , then  $O(2^m)$

workdays (empirical observation).

## Discussion

- PSATO: a distributed prover for propositional satisfiability.
- Partition the search space effectively.
- Accumulate search over time.
- Use non-dedicated general-purpose networks of workstations effectively.
- Achieve high scalability and fault-tolerance by the master/slave organization.
- Experiments: quasigroup problems.