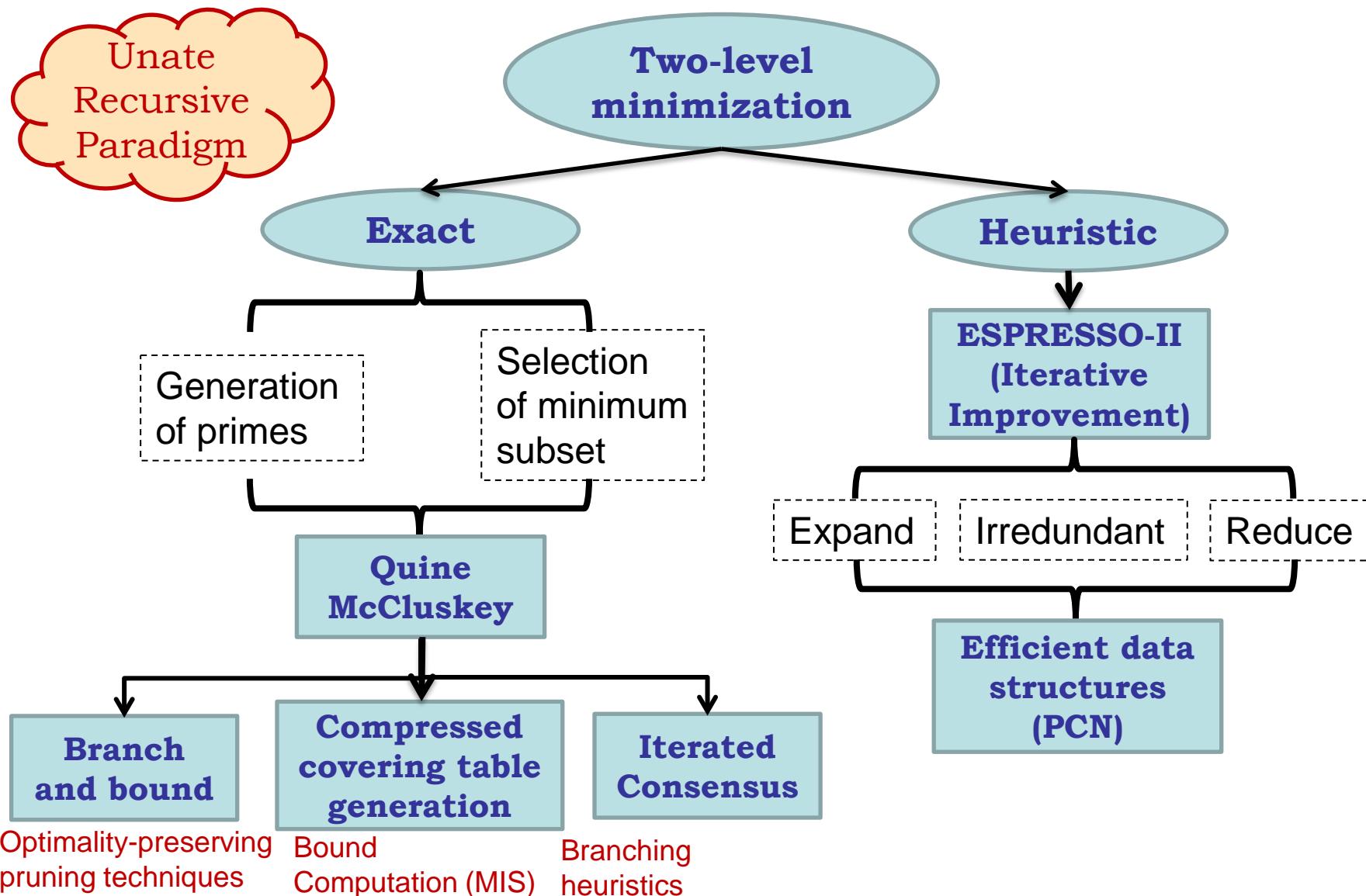


Two-level Minimization Techniques: Summary

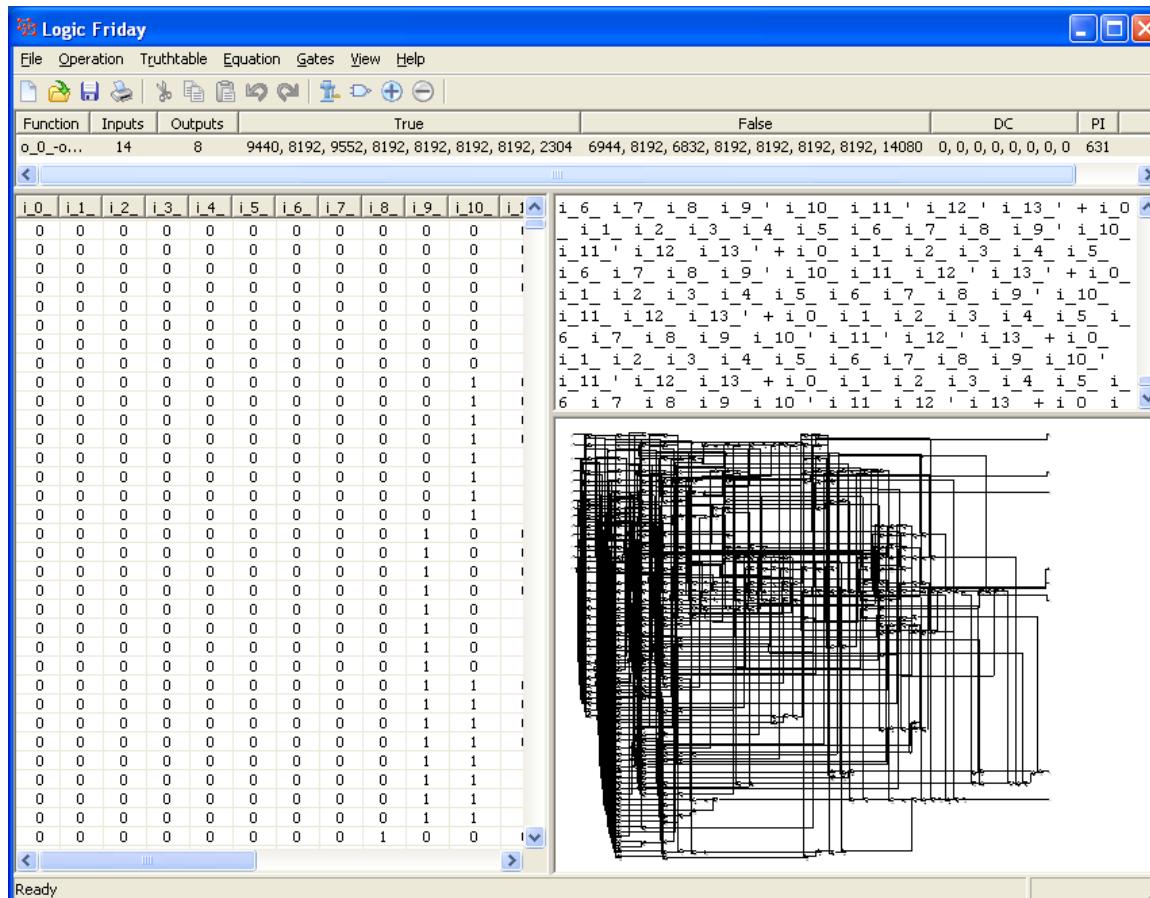


Further reading in two-level minimization

- Using BDDs to implicitly represent and solve the covering problem
 - “A New Viewpoint on Two-Level Logic Minimization,” O. Coudert, J. C. Madre, and H. Fraisse, Proc. Design Automation Conference, 1993, pp. 625-630.
- Better lower bound computation and pruning techniques
 - “New Ideas for Solving Covering Problems,” O. Coudert, J. C. Madre, Proc. Design Automation Conference, 1995, pp. 641-646.
- Using Linear Programming for Lower Bound Computation
 - “Solving Covering Problems Using LPR-Based Lower Bounds,” S. Liao and S. Devadas, Proc. Design Automation Conference, pp. 117-120, 1997.
- Do not generate primes that will not appear in the minimum solution
 - P. McGeer, J. Sanghavi, R. Brayton, and A. Sangiovanni-Vincentelli. Espresso-Signature: A New Exact Minimizer for Logic Functions. Design Automation Conference, pp. 618-624, 1993.
- Overview papers
 - “Complexity of two-level logic minimization,” C. Umans, T. Villa, and A. L. Sangiovanni-Vincentelli, IEEE Trans. On Computer-Aided Design, vol. 25, no. 7, pp. 1230-1246, July 2006.
 - “Two-level logic minimization: An overview,” O. Coudert, Integration – The VLSI Journal, vol. 17, no. 2, pp. 97-140, October 1994.

Demonstration: Logic Friday

- Free logic synthesis tool for students, hobbyists, and engineers who work on digital logic circuits (<http://www.sontrak.com>)
 - Based on ESPRESSO and MIS II packages from U.C. Berkeley



Logic Friday: What can it do?

- With Logic Friday you can
 - Enter and view a logic function as a truth table, an equation, or a gate diagram
 - Enter functions with up to 16 inputs and 16 outputs
 - Minimize a function with options of fast or exact minimization
 - Automatically generate a multi-level gate diagram using gates chosen from a library
 - Automatically minimize the number of standard gate packages
 - Trace the logic state of each gate's inputs and outputs for a given input vector
 - Compare logic functions
 - Generate new functions as logical combinations of others
 - Generate efficient, compact C code lookup functions from logic functions
 - Save functions and gate diagram images to files
 - Export and import truth tables as CSV files for editing in spreadsheet applications.

Example of ESPRESSO Input/Output

$$f(A,B,C,D) = \sum m(4,5,6,8,9,10,13) + \sum d(0,7,15)$$

Espresso Input

```
.i 4          -- # inputs
.o 1          -- # outputs
.ilb a b c d -- input names
.ob f          -- output name
.p 10         -- number of product terms
0100 1        -- A'BC'D'
0101 1        -- A'BC'D
0110 1        -- A'BCD'
1000 1        -- AB'C'D'
1001 1        -- AB'C'D
1010 1        -- AB'CD'
1101 1        -- ABC'D
0000 -         -- A'B'C'D' don't care
0111 -         -- A'BCD don't care
1111 -         -- ABCD don't care
.e
```

Espresso Output

```
.i 4
.o 1
.ilb a b c d
.ob f
.p 3
1-01    1
10-0    1
01--    1
.e
```

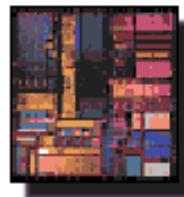
f =



ECE 595Z

Digital VLSI Design Automation

Module 4 (Lectures 11-13): Boolean Satisfiability



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MSEE 348

raghunathan@purdue.edu

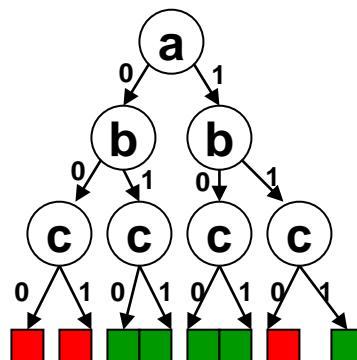
Acknowledgment : Prof. Sharad Malik, Princeton University

SAT in a Nutshell

- Given a Boolean formula, find a variable assignment such that the formula evaluates to 1, or prove that no such assignment exists.

$$F = (a + b)(a' + b' + c)$$

- For n variables, there are 2^n possible truth assignments to be checked.

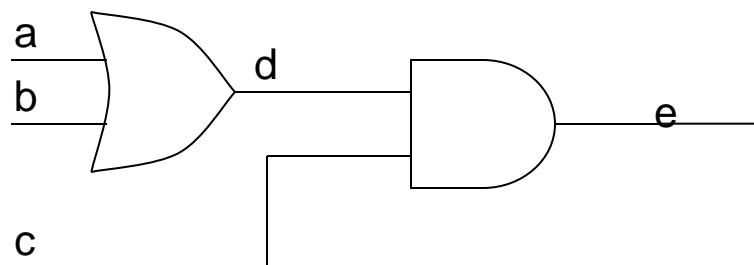


- First established NP-Complete problem.

S. A. Cook, The complexity of theorem proving procedures,
Proceedings, Third Annual ACM Symp. on the Theory of Computing, 1971, 151-158

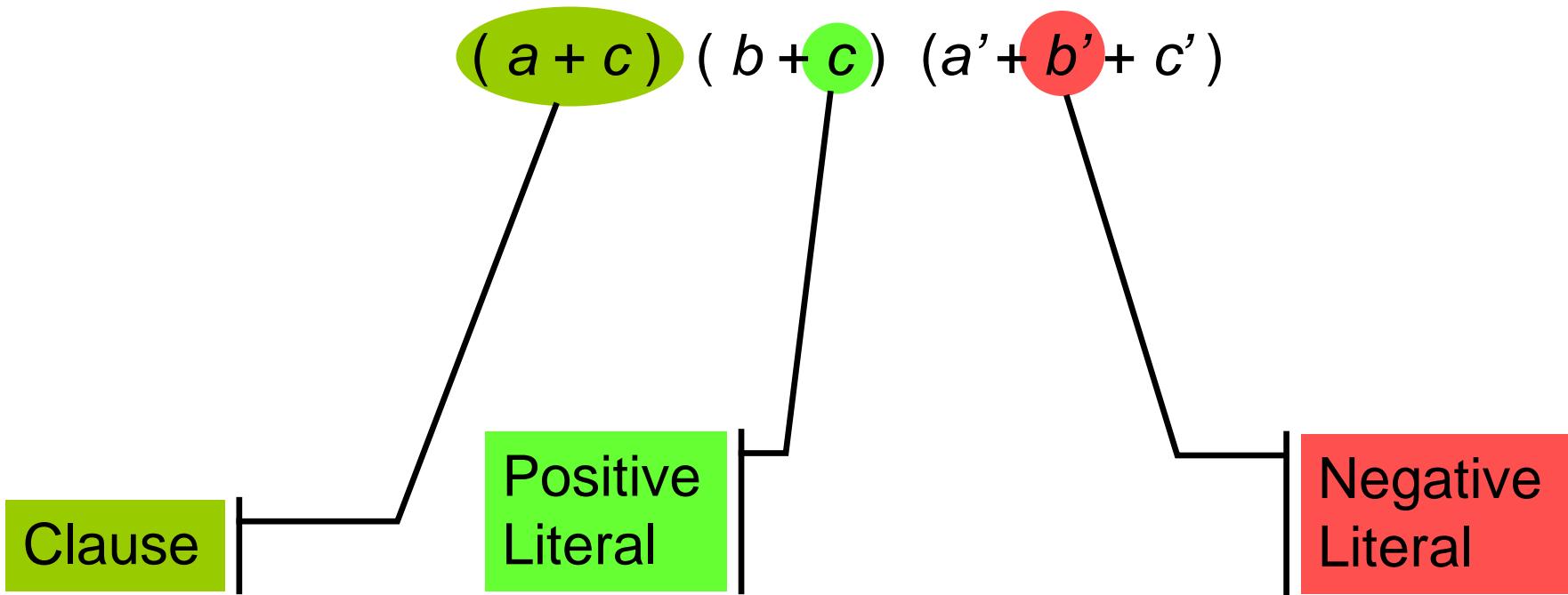
Problem Representation

- Conjunctive Normal Form (CNF)
 - $(a + b)(a' + b' + c)$
- Logic circuit representation
 - Circuits have structural and direction information
- Circuit – CNF conversion is straightforward – Tseitin Transformation



$$\begin{aligned}d &\equiv (a + b) \\(a + b + d') &\\(a' + d) &\\(b' + d) &\\e &\equiv (c \cdot d) \\(c' + d' + e) &\\(d + e') &\\(c + e')\end{aligned}$$

Terminology

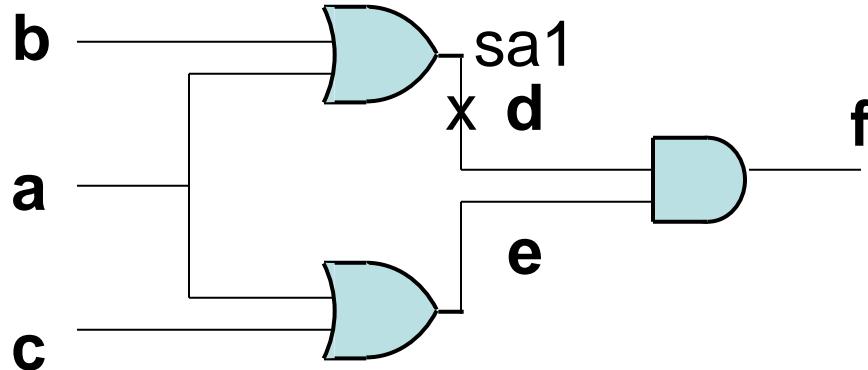


Why Bother?

- Core computational engine for major applications
 - AI
 - Knowledge base deduction
 - Automatic theorem proving
 - EDA
 - Testing
 - Verification
 - Timing analysis
 - Power analysis
 - and more...

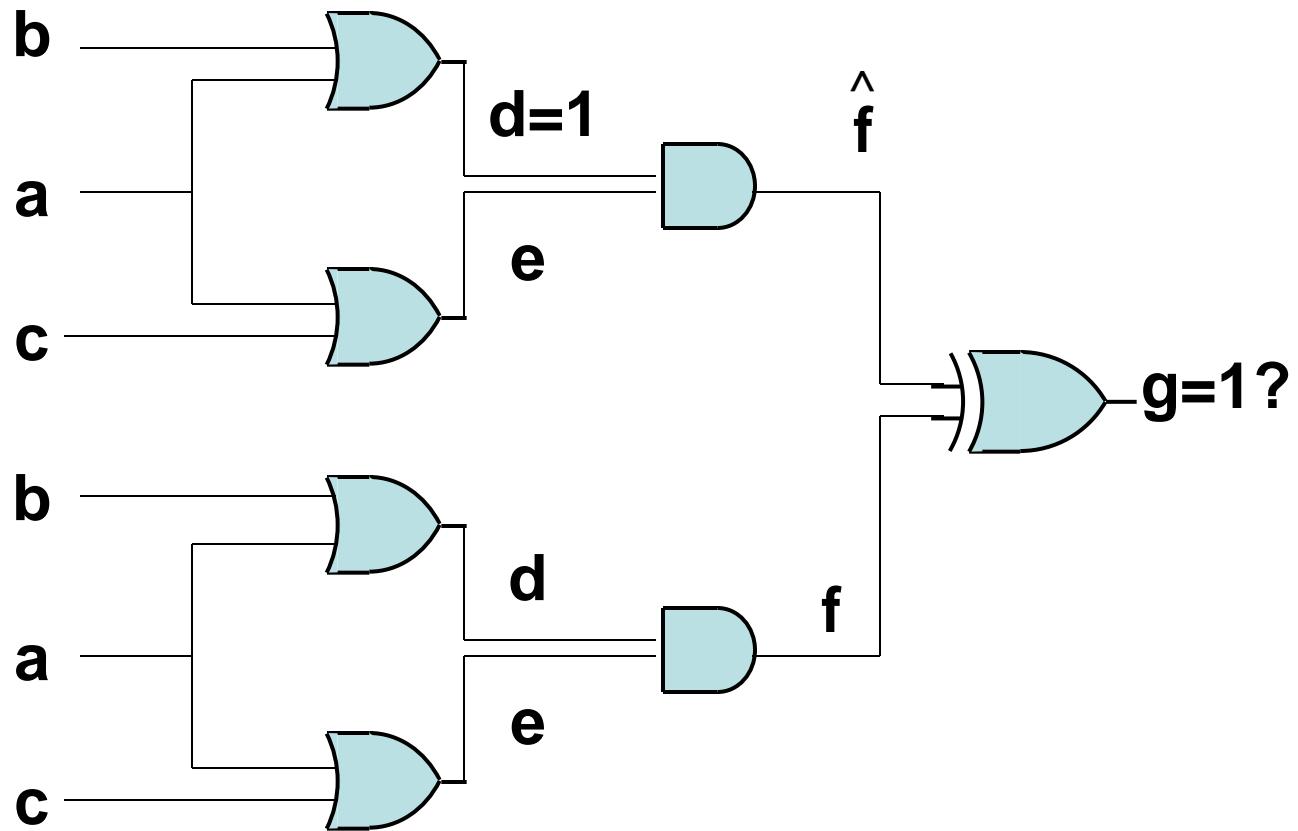
EDA Drivers for SAT

- Automatic Test Pattern Generation (ATPG)
 - Example: Manufacturing defects modeled as Stuck-at faults



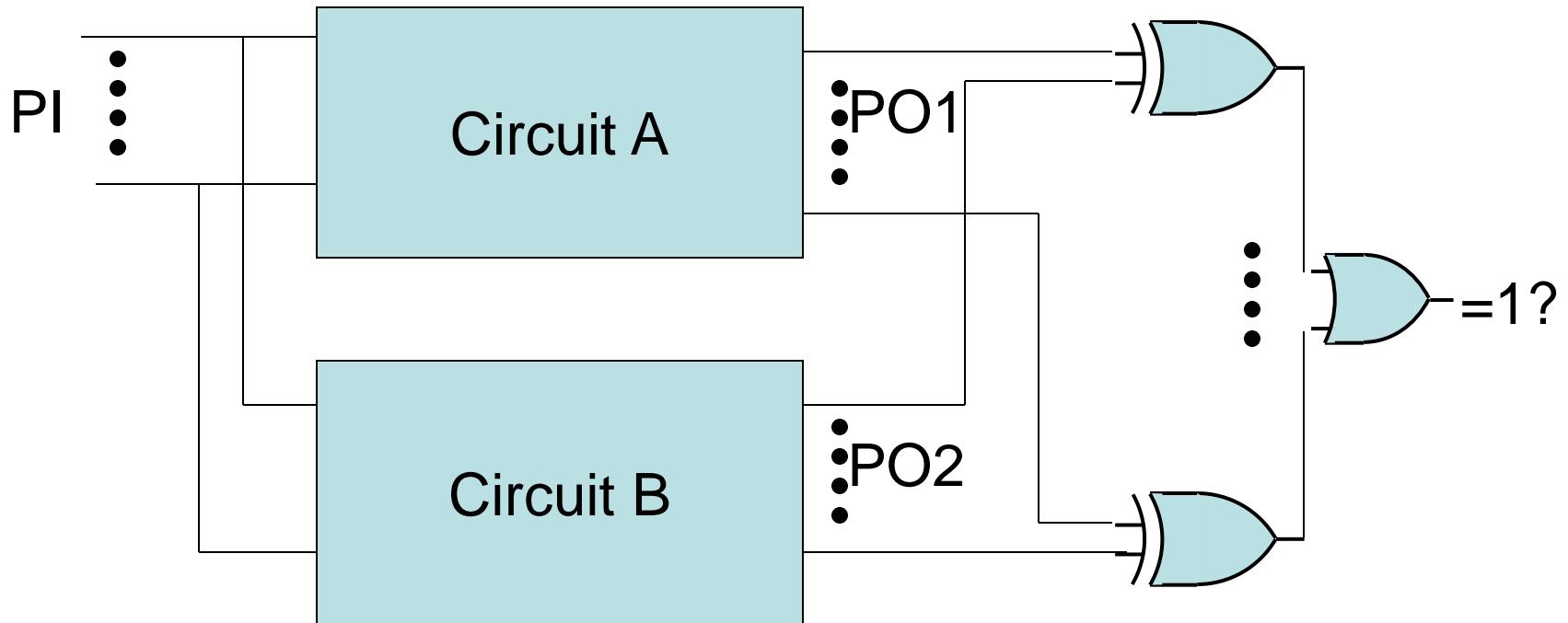
EDA Drivers for SAT

- ATPG
 - Miter : Two copies of a circuit feeding an XOR



EDA Drivers for SAT

- Combinational Equivalence Checking



History of SAT solvers

1869: William Stanley Jevons: Logic Machine



W S Jevons, *On the Mechanical Performance of Logical Inference*,
In Philosophical Transactions of the Royal Society, Vol. 160, Part II,
pp. 497-518, Oct. 1869.

W S Jevons; *Pure Logic and Other Minor Works, Pure Logic or the Logic of Quality Apart From the Quantity*; Macmillan and Co., London, 1890

The Logical Machine

- First attempt to construct a “reasoning” machine
 - Based on principle of “substitution of similars”
- Better known for his contributions to economics – marginal utility theory



William Stanley Jevons (1835-1882) economist and logician

Jevons' logical machine, exhibited before the Royal Society of London (1870)



For sale!

Amazon.com: Pure logic an x

www.amazon.com/Pure-logic-other-minor-works/dp/1177688549/ref=sr_1_1?ie=UTF8&qid=1329414714&sr=8-1

amazon.com Prime

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William Stanley Jevons (Author), Robert Adamson (Author), Harriet A Jevons (Author)

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History of SAT solvers

1952

Quine

Iterated Consensus

≈10 variables



W. V. Quine, “The problem of simplifying truth functions”, *Amer. Math Monthly* Vol. 59, pp. 521-531, 1952.

Recall Iterated Consensus?

- Iterated consensus generates all prime implicants.
 - Starting point is Disjunctive Normal Form (DNF) or SOP
- Iterated consensus can be used to check tautology of a DNF formula
 - For a tautological formula, the only prime is 1
- Tautology checking on DNF is the dual problem of satisfiability checking for CNF
 - A SAT Checking Procedure!

Iterated Consensus

CNF formula

$$(a + b + c)(b + c' + f')(b' + e)$$

CNF formula

$$(a + b) (a + b') (a' + c)(a' + c')$$

Iterated Consensus

CNF formula

$$(a + b + c)(b + c' + f')(b' + e)$$

DNF for complement

$$a'b'c' + b'cf + be'$$

CNF formula

$$(a + b)(a + b') (a' + c)(a' + c')$$

DNF for complement

$$a'b' + a'b + ac' + ac$$

Iterated Consensus

$$\begin{array}{c} a'b'c' + b'cf + be' \\ \swarrow \quad \searrow \\ + a'b'f \end{array}$$

$$a'b' + a'b + ac' + ac$$

Iterated Consensus

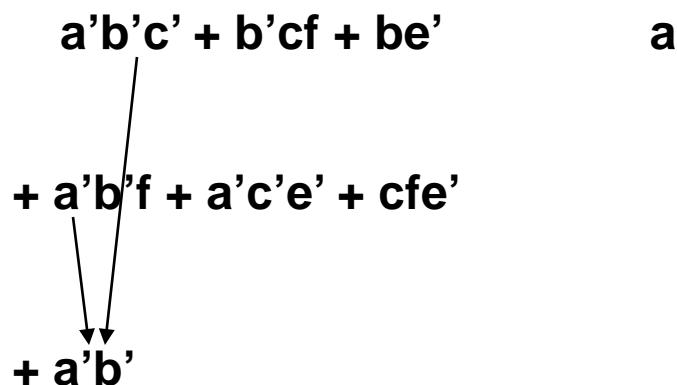
$$\begin{array}{c} a'b'c' + b'cf + be' \\ \swarrow \quad \searrow \\ + a'b'f + a'c'e' \end{array}$$
$$a'b' + a'b + ac' + ac$$

Iterated Consensus

$$\begin{aligned} & a'b'c' + b'cf + be' \\ & + a'b'f + a'c'e' + cfe' \end{aligned}$$

$$a'b' + a'b + ac' + ac$$

Iterated Consensus

$$\begin{aligned} & a'b'c' + b'cf + be' \\ & + a'b'f + a'c'e' + cfe' \\ & + a'b' \end{aligned}$$


$$a'b' + a'b + ac' + ac$$

Iterated Consensus

$$\begin{aligned} & \cancel{a'b'c'} + b'cf + be' \\ & + \cancel{a'b'f} + a'c'e' + cfe' \\ & + a'b' + a'b'e'f \end{aligned}$$

Iterated Consensus

$$\cancel{a'b'c'} + b'cf + be'$$

$$a'b' + a'b + ac' + ac$$

$$+ \cancel{a'b'f} + a'c'e' + cfe'$$

$$+ a'b' + \cancel{a'b'e'f}$$

Iterated Consensus

$$\cancel{a'b'c' + b'cf + be'}$$

$$a'b' + a'b + ac' + ac$$

$$+ \cancel{a'b'f} + a'c'e' + cfe'$$

$$+ a'b' + a'b'e'f + a'e'f$$

Iterated Consensus

$$\begin{aligned} & \cancel{a'b'c'} + b'cf + be' \\ & + \cancel{a'b'f} + \cancel{a'c'e'} + cfe' \\ & + a'b' + \cancel{a'b'e'f} + \cancel{a'e'f} \\ & + a'e' \end{aligned}$$

Iterated Consensus

$$\cancel{a'b'c' + b'cf + be'}$$

$$a'b' + a'b + ac' + ac$$

$$+ \cancel{a'b'f} + \cancel{a'c'e'} + cfe'$$

$$+ \cancel{a'b'} + \cancel{a'b'e'f} + \cancel{a'e'f}$$

$$+ a'e'$$

Iterated Consensus

$$\cancel{a'b'c'} + b'cf + be'$$

$$a'b' + a'b + ac' + ac$$

$$+ \cancel{a'b'f} + \cancel{a'c'e'} + cfe'$$

$$+ \cancel{a'b'} + \cancel{a'b'e'f} + \cancel{a'e'f}$$

$$+ a'e'$$

No more implicants
can be generated,
not a tautology

Iterated Consensus

$$\begin{aligned} & \cancel{a'b'c'} + b'cf + be' \\ & + \cancel{a'b'f} + \cancel{a'c'e'} + cfe' \end{aligned}$$

$$\begin{aligned} & + a'b' + \cancel{a'b'e'f} + \cancel{a'e'f} \\ & + a'e' \end{aligned}$$

$$\begin{aligned} & a'b' + a'b + ac' + ac \\ & \quad \downarrow \quad \downarrow \\ & + a' \end{aligned}$$

No more implicants
can be generated,
not a tautology

Iterated Consensus

$$\cancel{a'b'c'} + b'cf + be'$$

$$\cancel{a'b'} + \cancel{a'b} + ac' + ac$$

$$+ \cancel{a'b'f} + \cancel{a'c'e'} + cfe'$$

$$+ a'$$

$$+ a'b' + \cancel{a'b'e'f} + \cancel{a'e'f}$$

$$+ a'e'$$

No more implicants
can be generated,
not a tautology

Iterated Consensus

$$\cancel{a'b'c' + b'cf + be'}$$

$$+ \cancel{a'b'f} + \cancel{a'c'e'} + cfe'$$

$$+ \cancel{a'b'} + \cancel{a'b'e'f} + \cancel{a'e'f}$$

$$+ a'e'$$

$$\cancel{a'b'} + \cancel{a'b} + ac' + ac$$

$$+ a' + a$$

No more implicants
can be generated,
not a tautology

Iterated Consensus

$$\cancel{a'b'c'} + b'cf + be'$$

$$+ \cancel{a'b'f} + \cancel{a'c'e'} + cfe'$$

$$+ \cancel{a'b'} + \cancel{a'b'e'f} + \cancel{a'e'f}$$

$$+ a'e'$$

$$\cancel{a'b'} + \cancel{a'b} + \cancel{ac'} + \cancel{ac}$$

$$+ a' + a$$

No more implicants
can be generated,
not a tautology

Iterated Consensus

$$\begin{aligned} & \cancel{a'b'c'} + b'cf + be' \\ & + \cancel{a'b'f} + \cancel{a'c'e'} + cfe' \\ & + \cancel{a'b'} + \cancel{a'b'e'f} + \cancel{a'e'f} \\ & + a'e' \end{aligned}$$
$$\begin{aligned} & a'b' + a'b + ac' + ac \\ & + a' + a \\ & + 1 \end{aligned}$$

No more implicants
can be generated,
not a tautology

Iterated Consensus

$$\cancel{a'b'c'} + b'cf + be'$$

$$+ \cancel{a'b'f} + \cancel{a'c'e'} + cfe'$$

$$+ \cancel{a'b'} + \cancel{a'b'e'f} + \cancel{a'e'f}$$

$$+ a'e'$$

$$\cancel{a'b'} + \cancel{a'b} + \cancel{ac'} + \cancel{ac}$$

$$+ \cancel{a'} + \cancel{a}$$

$$+ 1$$

No more implicants
can be generated,
not a tautology

Iterated Consensus

$$\cancel{a'b'c'} + b'cf + be'$$

$$+ \cancel{a'b'f} + \cancel{a'c'e'} + cfe'$$

$$+ a'b' + \cancel{a'b'e'f} + \cancel{a'e'f}$$

$$+ a'e'$$

$$\cancel{a'b'} + \cancel{a'b} + \cancel{ac'} + \cancel{ac}$$

$$+ \cancel{a'} + \cancel{a}$$

$$+ 1$$

Tautology

No more implicants
can be generated,
not a tautology

The Timeline

1960

Davis Putnam
Resolution
≈10 variables

1952

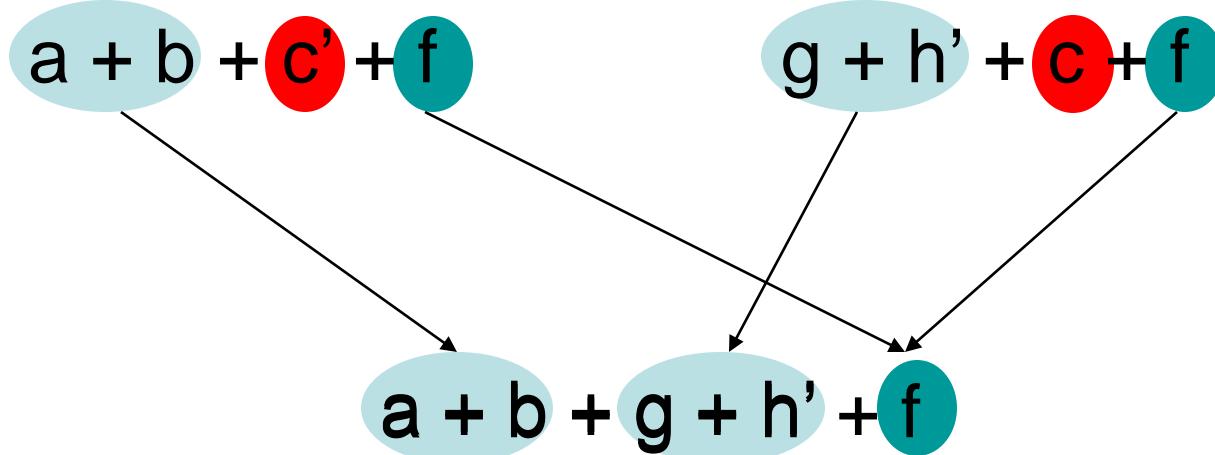
Quine
≈10 var



M .Davis, H. Putnam, "A computing procedure for quantification theory", *J. of ACM*, Vol. 7, pp. 201-214, 1960

Resolution

- Resolution of a pair of clauses with exactly ONE incompatible variable

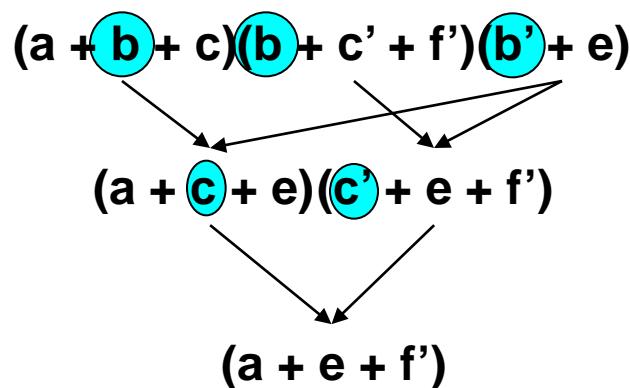


Resolution is the dual of consensus!

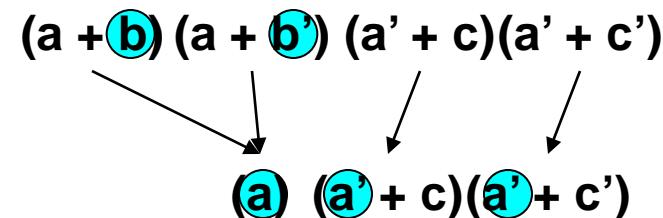
Davis Putnam Algorithm

Iteratively select a variable for resolution till no more variables are left.

- Can discard all original clauses after each iteration.



SAT



UNSAT

Potential memory explosion problem!

The Timeline



M. Davis, G. Logemann and D. Loveland, "A Machine Program for Theorem-Proving", *Communications of ACM*, Vol. 5, No. 7, pp. 394-397, 1962

DLL Algorithm

- Davis, Logemann and Loveland
- Basic framework for many modern SAT solvers
- Also known as DPLL for historical reasons

Basic DLL Procedure - DFS

$(a' + b + c)$

$(a + c + d)$

$(a + c + d')$

$(a + c' + d)$

$(a + c' + d')$

$(b' + c' + d)$

$(a' + b + c')$

$(a' + b' + c)$

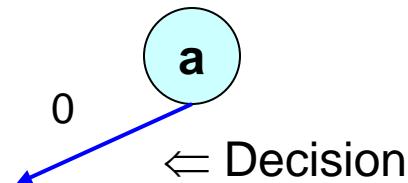
Basic DLL Procedure - DFS

($a' + b + c$)
($a + c + d$)
($a + c + d'$)
($a + c' + d$)
($a + c' + d'$)
($b' + c' + d$)
($a' + b + c'$)
($a' + b' + c$)

a

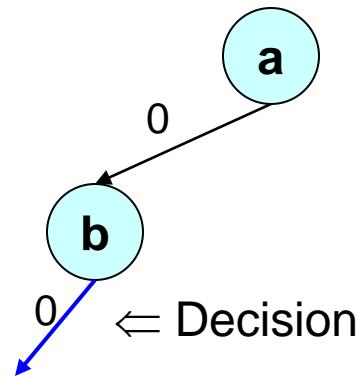
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



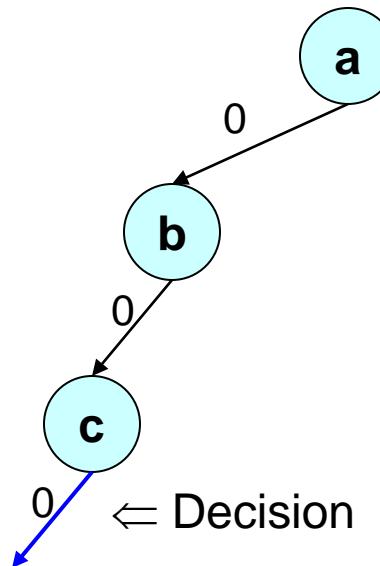
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



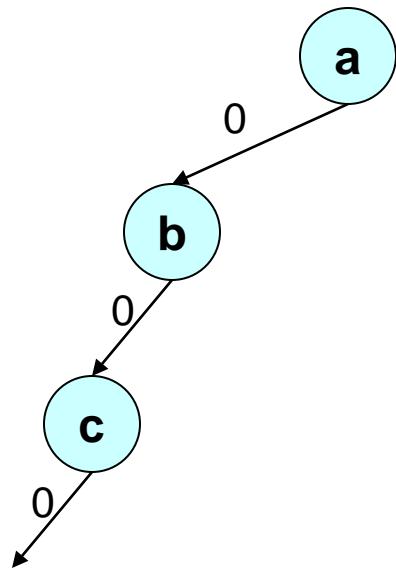
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$

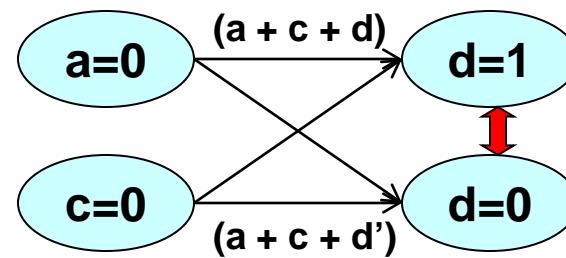


Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



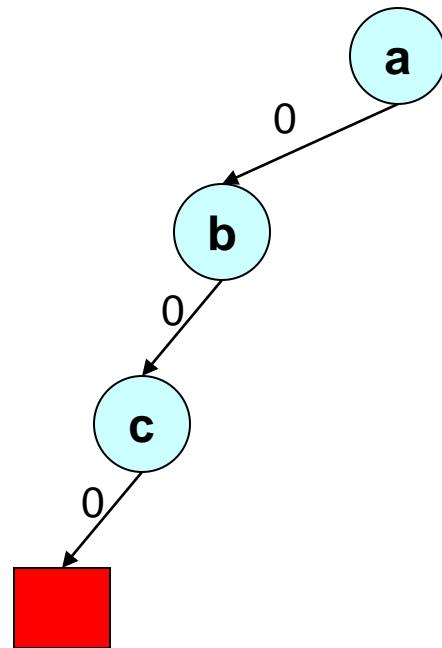
Implication Graph



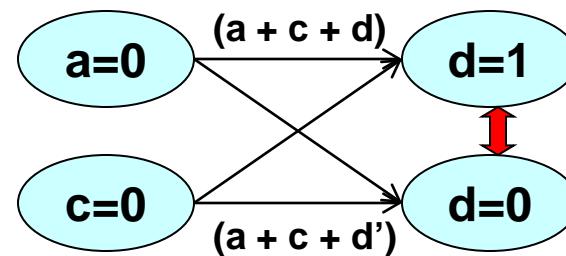
Conflict!

Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



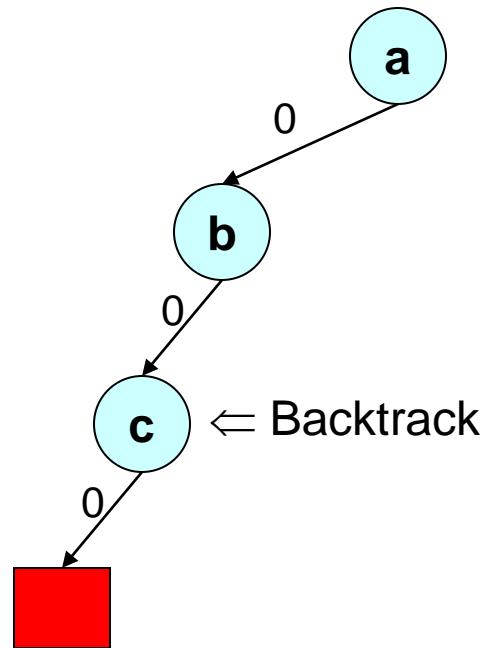
Implication Graph



Conflict!

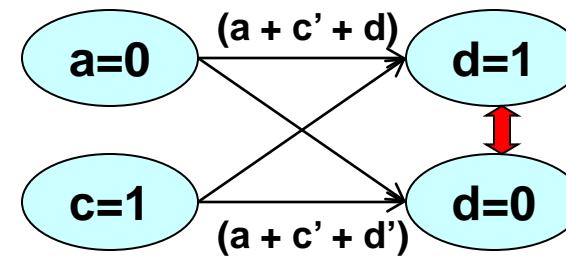
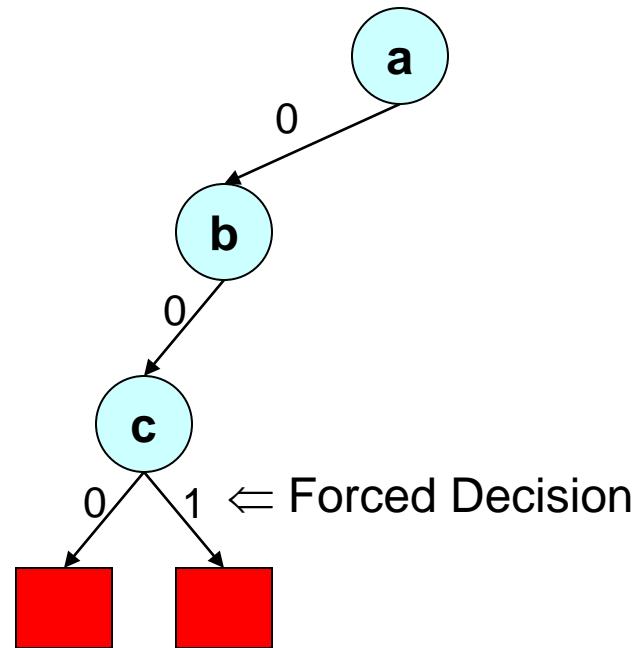
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



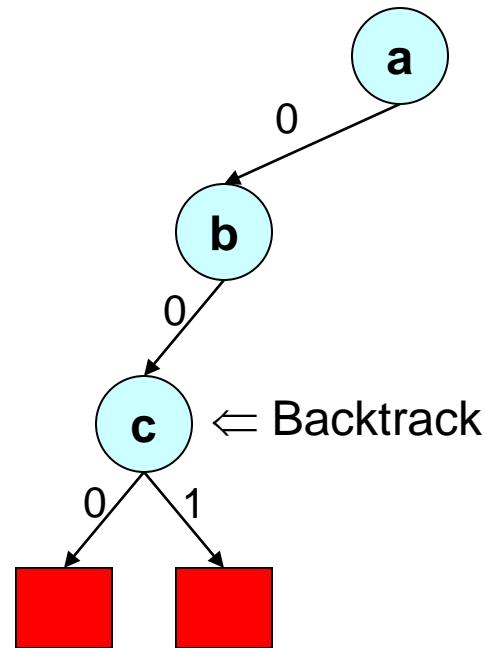
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



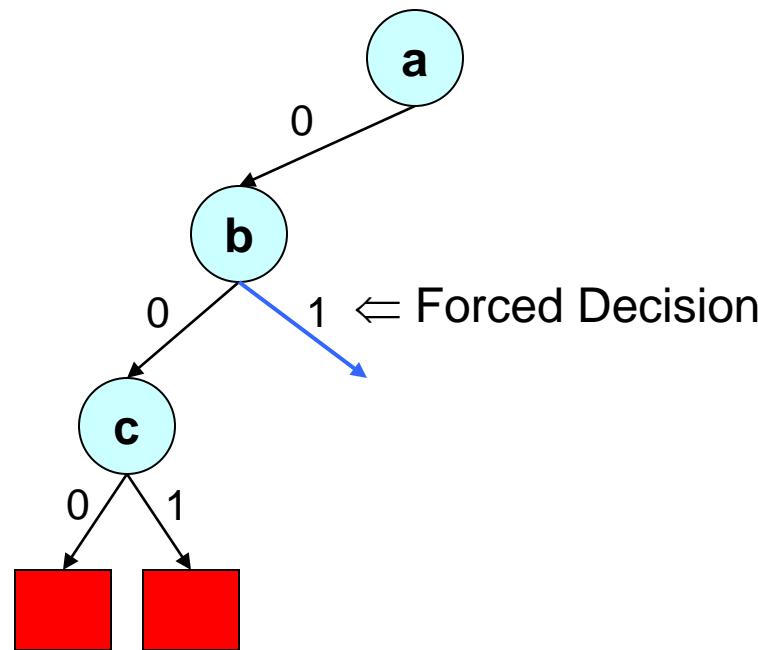
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



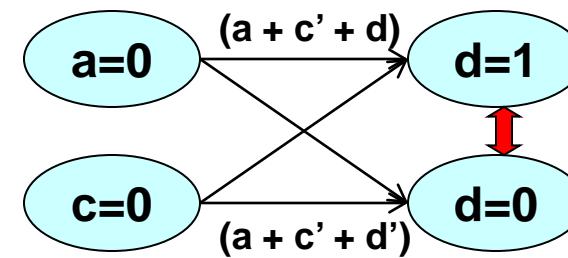
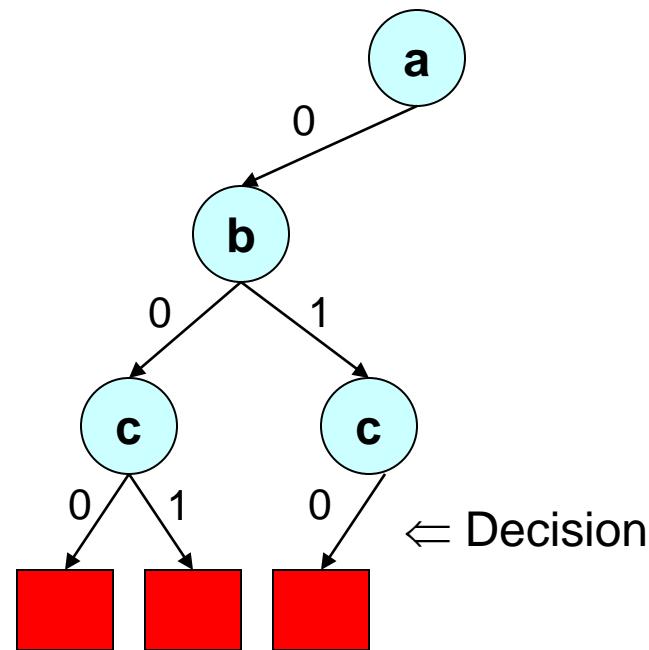
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



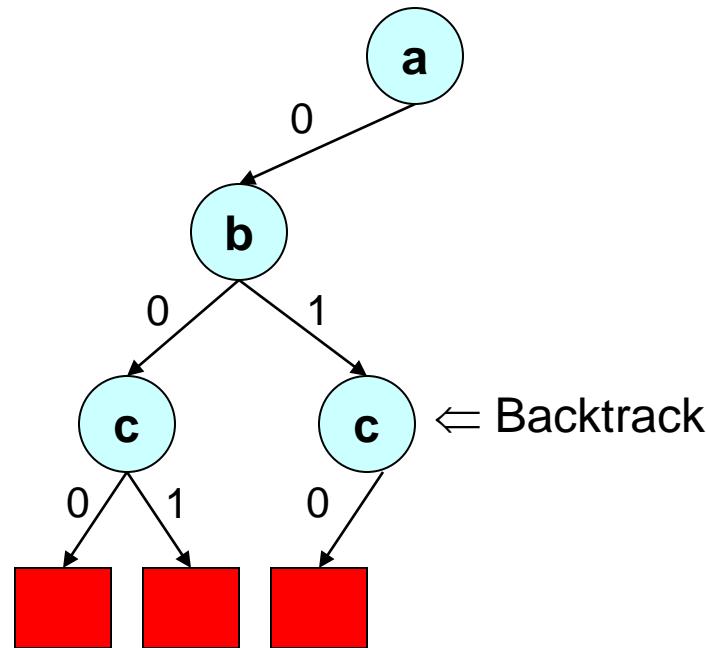
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



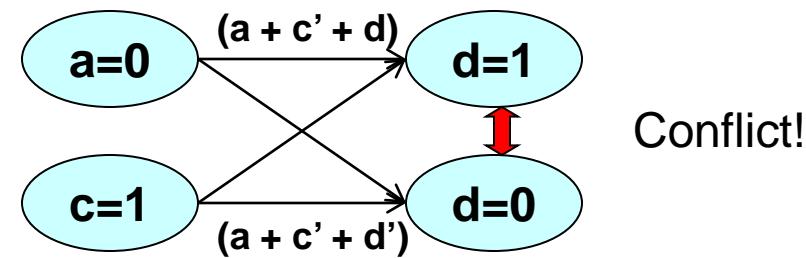
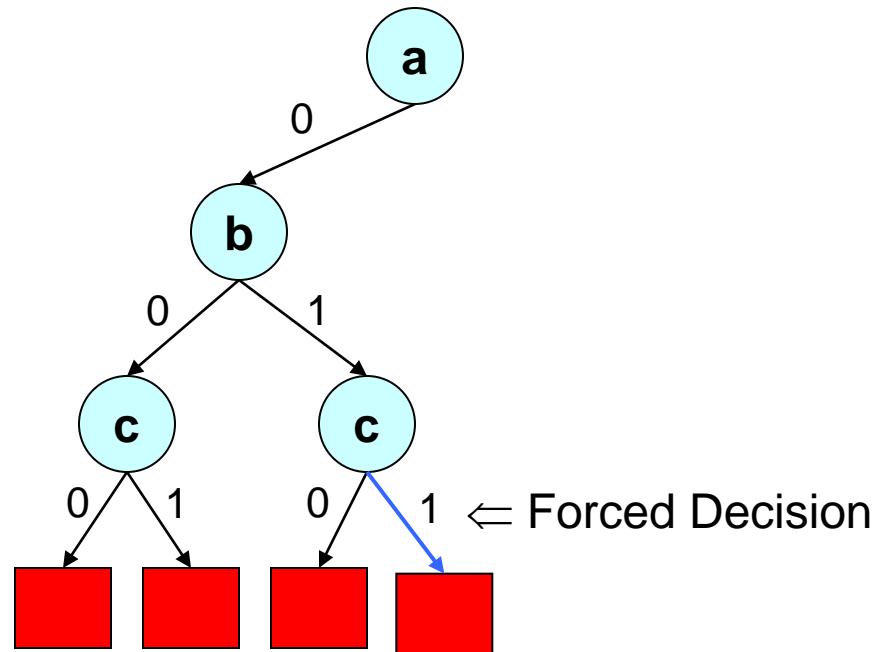
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



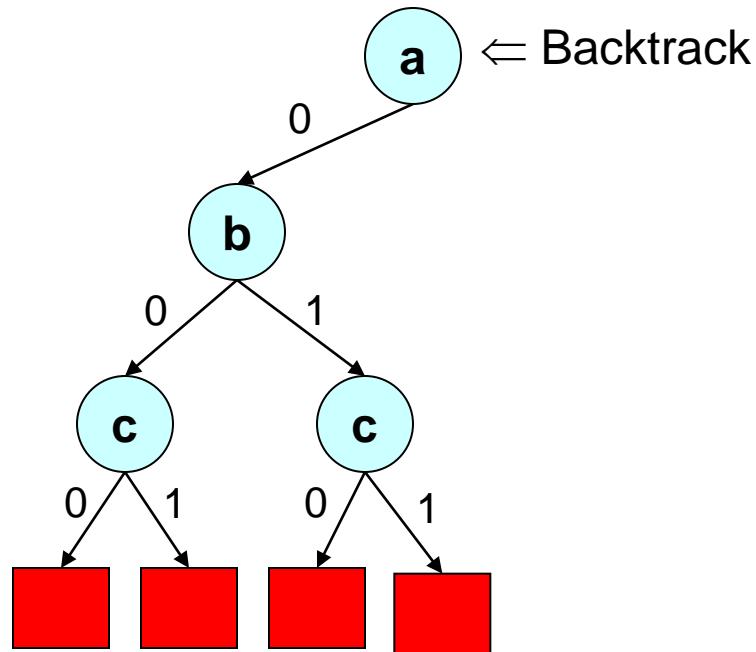
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



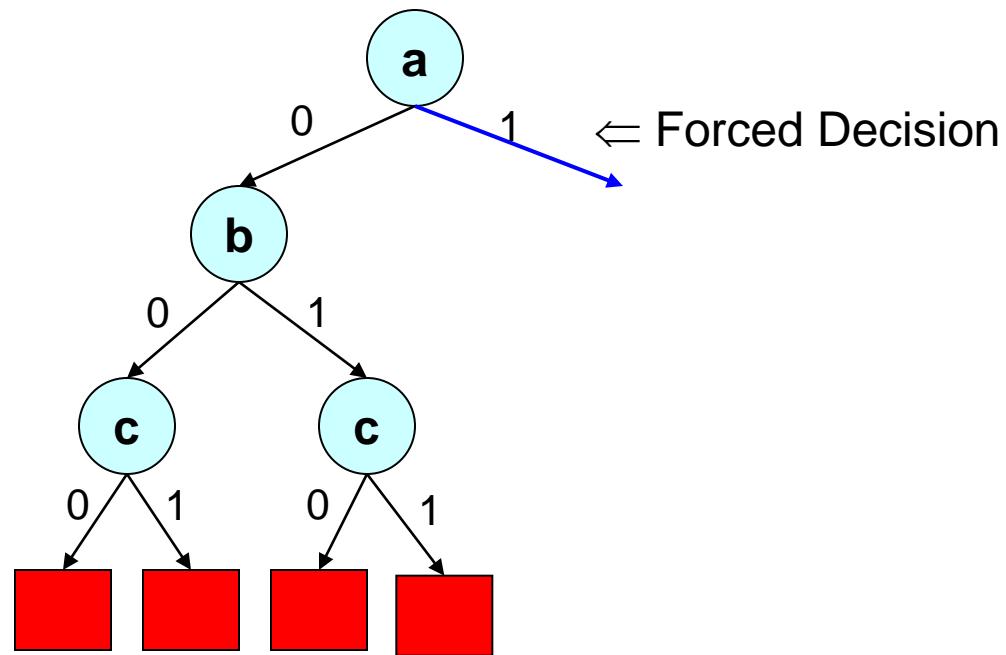
Basic DLL Procedure - DFS

($a' + b + c$)
($a + c + d$)
($a + c + d'$)
($a + c' + d$)
($a + c' + d'$)
($b' + c' + d$)
($a' + b + c'$)
($a' + b' + c$)



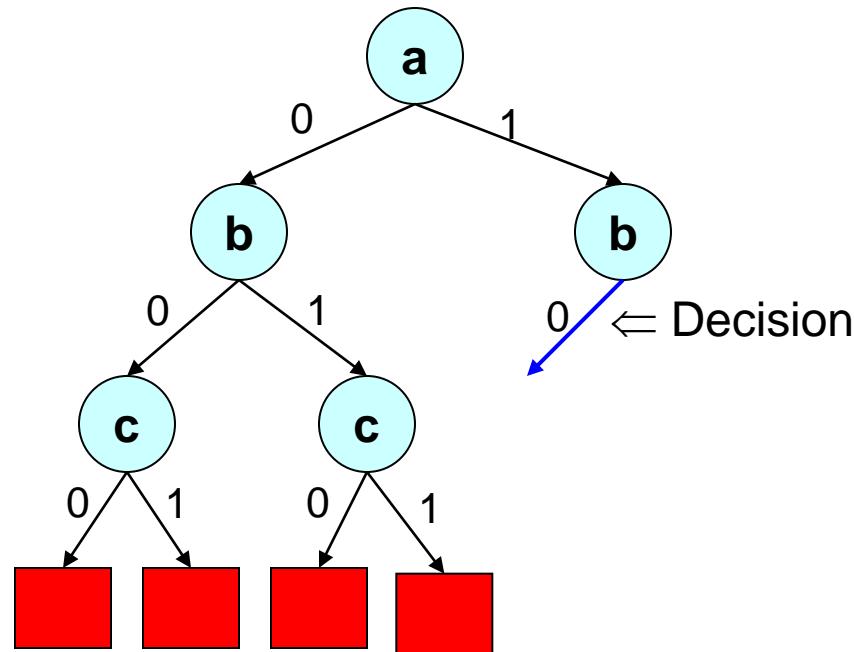
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



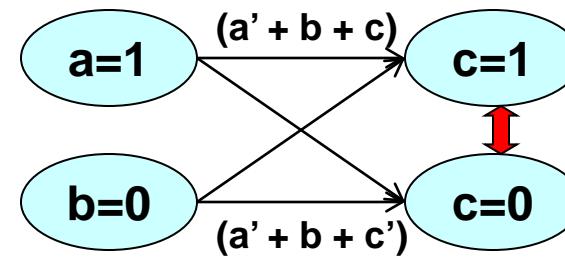
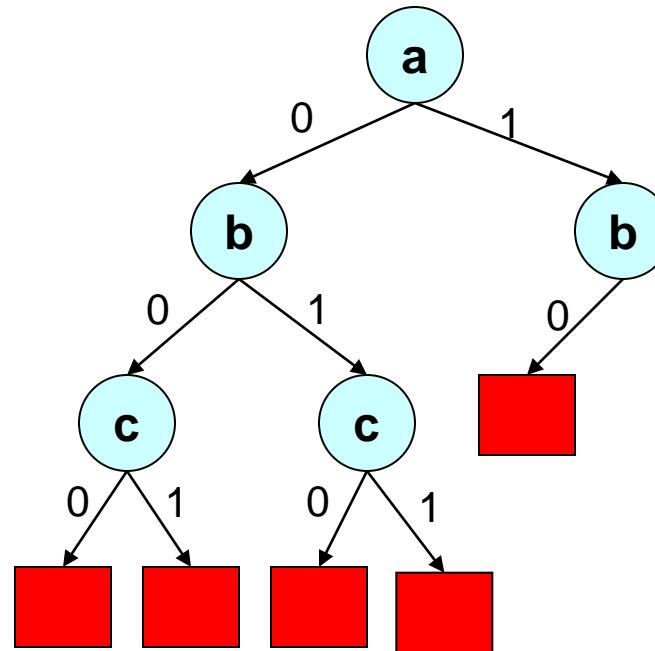
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



Basic DLL Procedure - DFS

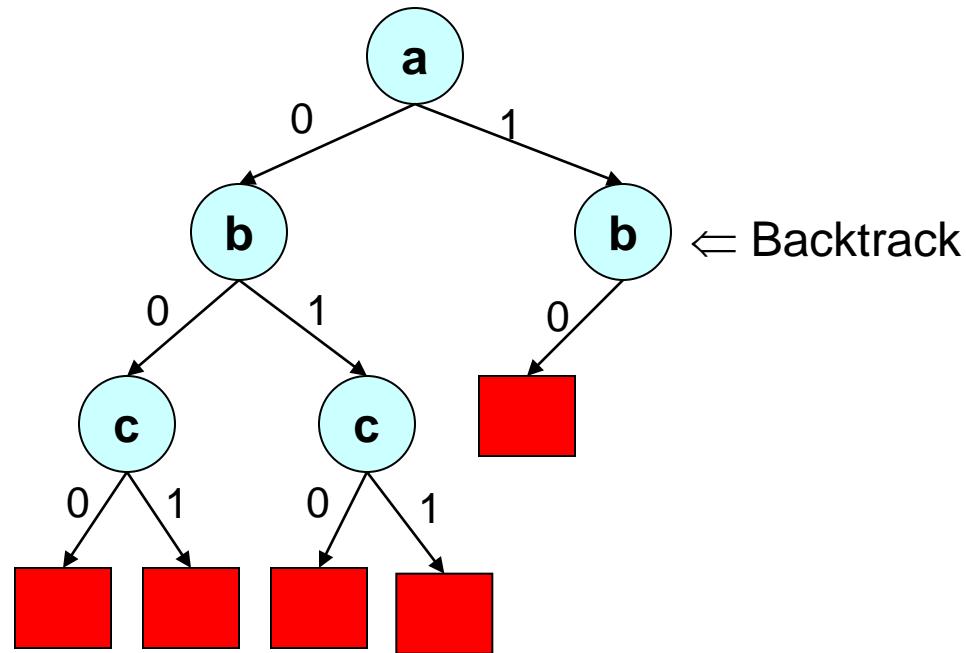
$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



Conflict!

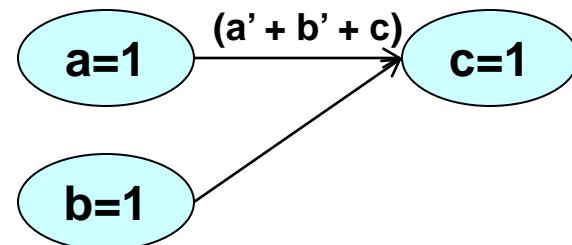
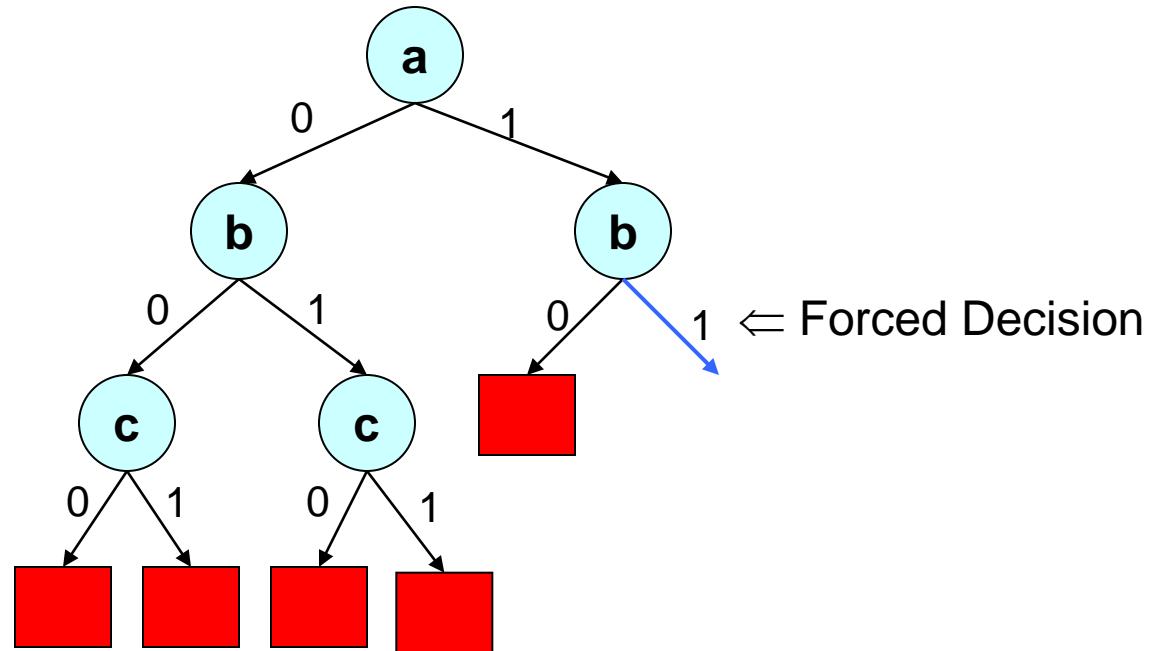
Basic DLL Procedure - DFS

$(a' + b + c)$
$(a + c + d)$
$(a + c + d')$
$(a + c' + d)$
$(a + c' + d')$
$(b' + c' + d)$
$(a' + b + c')$
$(a' + b' + c)$



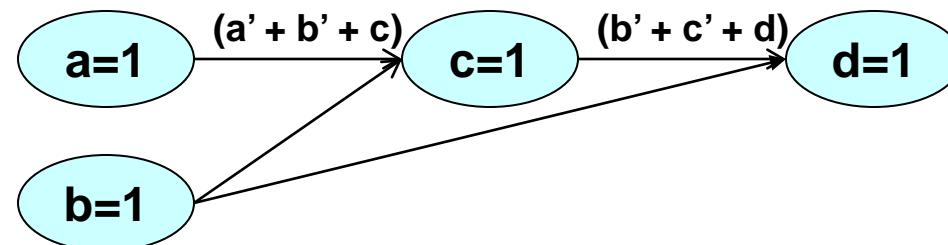
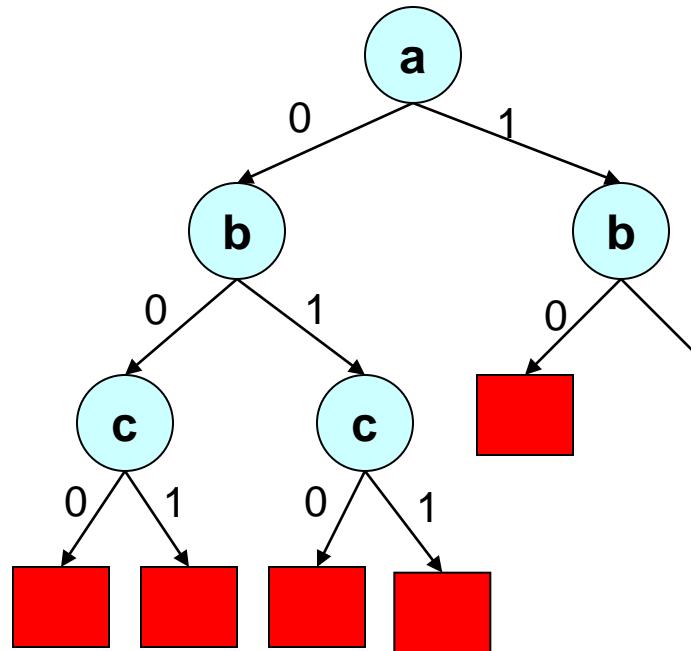
Basic DLL Procedure - DFS

($a' + b + c$)
($a + c + d$)
($a + c + d'$)
($a + c' + d$)
($a + c' + d'$)
($b' + c' + d$)
($a' + b + c'$)
($a' + b' + c$)



Basic DLL Procedure - DFS

($a' + b + c$)
($a + c + d$)
($a + c + d'$)
($a + c' + d$)
($a + c' + d'$)
($b' + c' + d$)
($a' + b + c'$)
($a' + b' + c$)



Basic DLL Procedure - DFS

$(a' + b + c)$
 $(a + c + d)$
 $(a + c + d')$
 $(a + c' + d)$
 $(a + c' + d')$
 $(b' + c' + d)$
 $(a' + b + c')$
 $(a' + b' + c)$

