# Formal Equivalence Checking - II

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#### Formal Equivalence Checking

- BDD is canonical form of representation
- Shannon's expansion theorem

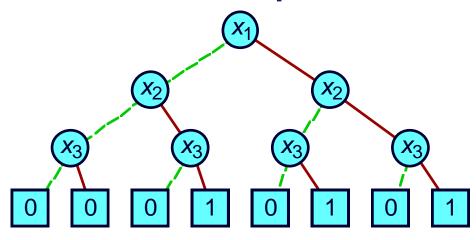
 $X_i$ 

$$f(x_1, x_2, ..., x_i=0, .....x_n)$$

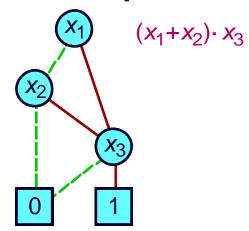
$$f(x_1, x_2, ..., x_i=1, .....x_n)$$

## **Example OBDD**

#### **Initial Graph**



#### **Reduced Graph**



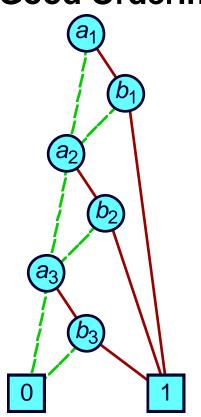
- Canonical representation of Boolean function
  - For given variable ordering
  - Two functions equivalent if and only if graphs isomorphic o Can be tested in linear time
  - Desirable property: simplest form is canonical.



### Effect of Variable Ordering

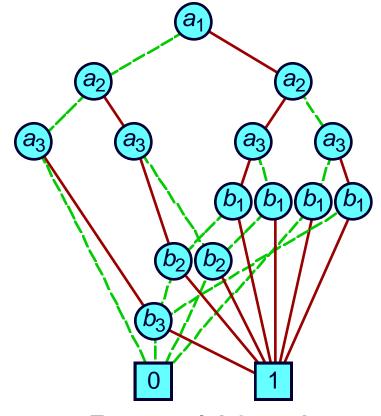
### $(a_1 \wedge b_1) \vee (a_2 \wedge b_2) \vee (a_3 \wedge b_3)$

#### **Good Ordering**



**Linear Growth** 

#### **Bad Ordering**



**Exponential Growth** 



### Sample Function Classes

Function Class	Best	Worst	Ordering Sensitivity
ALU (Add/Sub)	linear	exponential	High
Symmetric	linear	quadratic	None
Multiplication	exponential	exponential	Low

#### General Experience

- Many tasks have reasonable OBDD representations
- Algorithms remain practical for up to 500,000 node OBDDs
- Heuristic ordering methods generally satisfactory



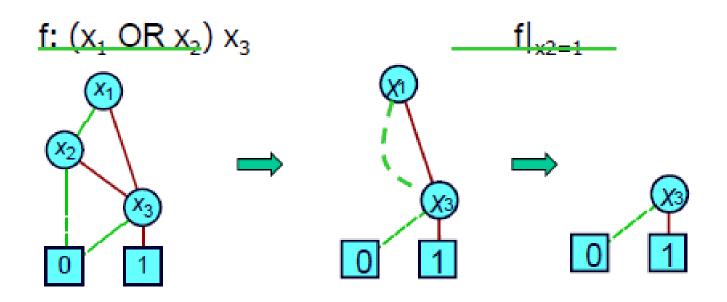
#### **ROBDD sizes & variable ordering**

- Bad News
  - Finding optimal variable ordering NP-Hard
  - Some functions have exponential BDD size for all orders e.g. multiplier
- Good News ©
  - Many functions/tasks have reasonable size ROBDDs
  - Algorithms remain practical up to 500,000 node OBDDs
  - Heuristic ordering methods generally satisfactory
- What works in Practice
  - Application-specific heuristics e.g. DFS-based ordering for combinational circuits
  - Dynamic ordering based on variable sifting (R. Rudell)



### Operations with BDD (1/5)

- \*Restriction: A restriction to a function to x=d, denoted  $f|_{x=d}$ , where  $x \in var(f)$ , and  $d \in \{0,1\}$ , is equal to f after assigning x = d.
- ❖ Given BDD of f, deriving BDD of f|<sub>x=d</sub> is simple



### Operations with BDD (2/5)

- Let  $v_1$ ,  $v_2$  denote root nodes of  $f_1$ ,  $f_2$  respectively, with  $var(v_1) = x_1$  and  $var(v_2) = x_2$
- ❖ If v₁ and v₂ are leafs, f₁ OP f₂ is a leaf node with value val(v₁) OP val(v₂)

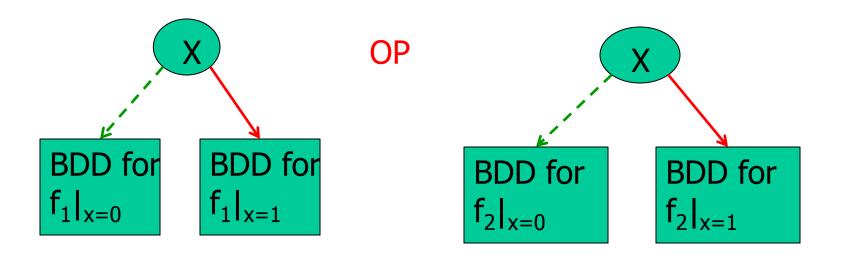
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### Operations with BDD (3/5)

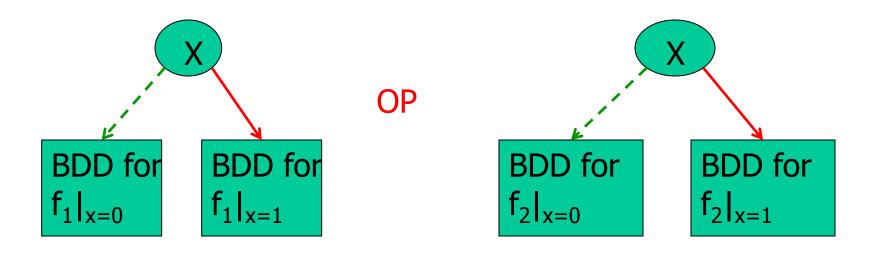
• If  $x_1 = x_2 = x$ , apply shanon's expansion

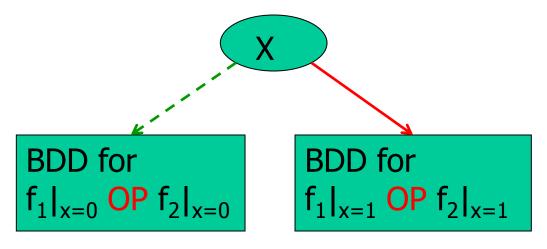
$$f_1 ext{ OP } f_2 = x \cdot (f_1|_{x=0} ext{ OP } f_2|_{x=0}) + x' \cdot (f_1|_{x=1} ext{ OP } f_2|_{x=1})$$





### Operations with BDD (4/5)



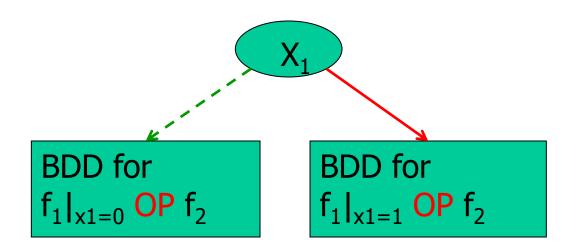




### Operations with BDD (5/5)

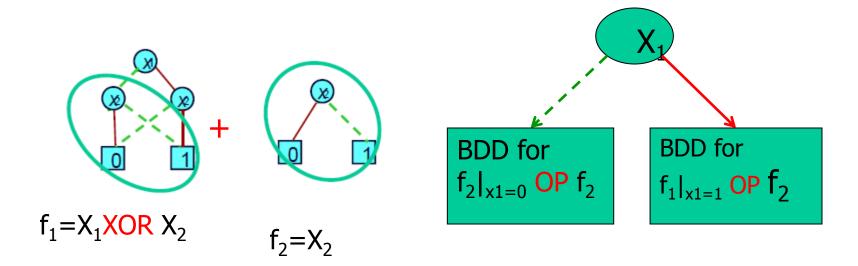
❖ Else suppose  $x_1 < x_2 = x$ , in variable order

$$f_1 ext{ OP } f_2 = x_1 (f_1|_{x_1=0} ext{ OP } f_2) + x_1' (f_1|_{x_1=1} ext{ OP } f_2)$$



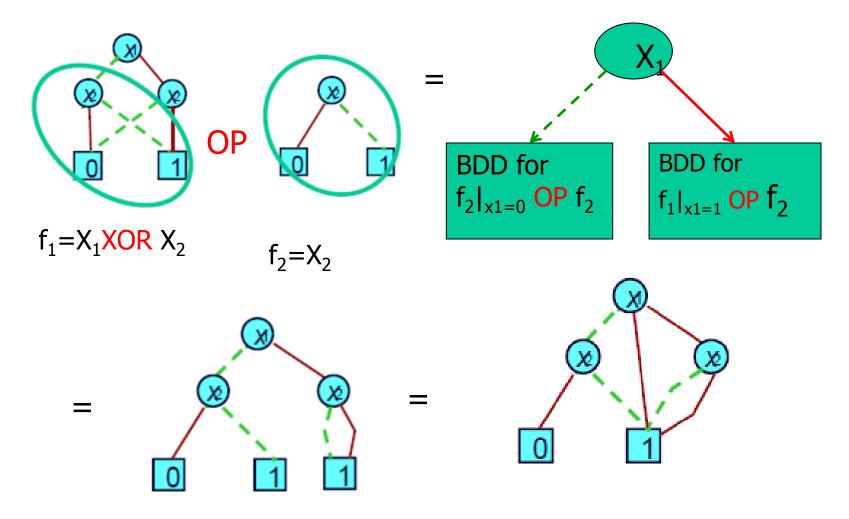


### Operations with BDD: Example

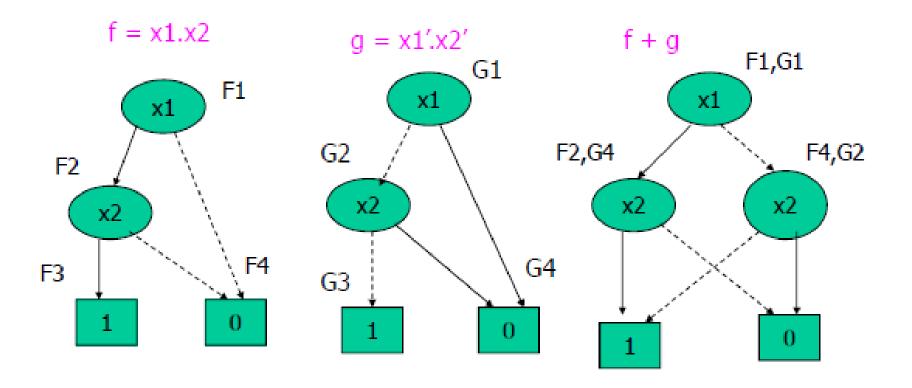


$$\begin{array}{c} \text{BDD for} \\ f_2|_{x1=0} \text{ OP } f_2 \end{array} = \begin{array}{c} \\ \\ \hline 0 \end{array} \begin{array}{c} \\ \hline 1 \end{array} \begin{array}{c} \\ \hline \end{array} \begin{array}{c} \\ \\ \hline \end{array} \begin{array}{c} \\ \end{array} \end{array} \begin{array}{c} \\ \end{array} \end{array} \begin{array}{c} \\ \end{array} \end{array} \begin{array}{c} \\ \end{array} \begin{array}$$

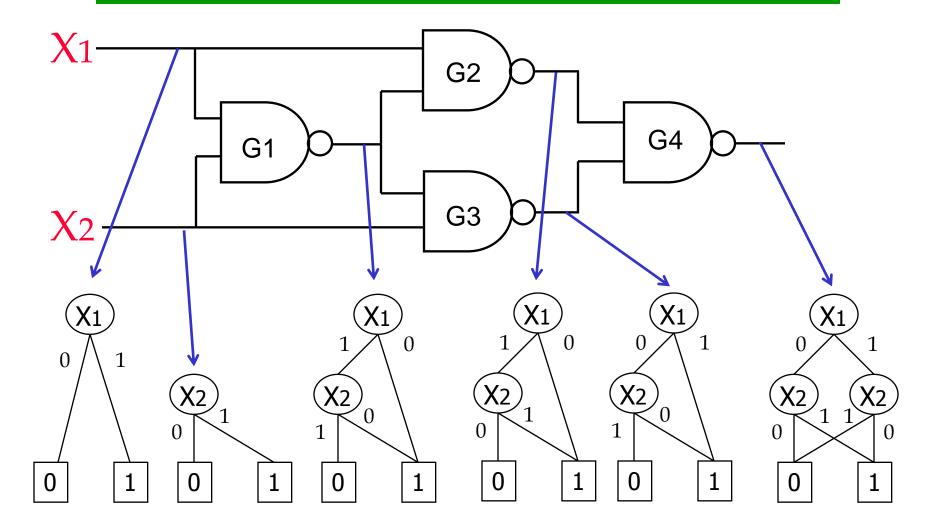
### Operations with BDD: Example



### Operations with BDD: Example



#### From circuits to BDD





### Variants of decision diagrams

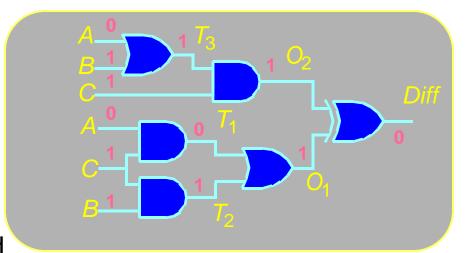
- Multiterminal BDDs (MTBDD) Pseudo Boolean functions B<sup>n</sup> → N, terminal nodes are integers
- Ordered Kronecker FunctionalDecision Diagrams (OKFDD) uses XOR in OBDDs
- Binary Moment Diagrams (BMD) good for arithmetic operations and word-level representation
- Zero-suppressed BDD (ZDD) good for representing sparse sets
- Partitioned OBDDs (POBDD) highly compact representation which retains most of the features of ROBDDs
- BDD packages
  - CUDD from Univ. of Colorado, Boulder,
  - CMU BDD package from Carnegie Mellon Univ.
  - In addition, companies like Intel, Fujitsu, Motorola etc. have their own internal BDD packages



### Formal Equivalence Checking

#### Satisfiability Formulation

- Search for input assignment giving different outputs
- Branch & Bound
  - Assign input(s)
  - Propagate forced values
  - Backtrack when cannot succeed



#### Challenge

- Must prove all assignments fail
  - Co-NP complete problem
- Typically explore significant fraction of inputs
- Exponential time complexity



#### **SAT Problem definition**

#### Given a CNF formula, f:

A set of variables, V

- (a,b,c)
- Conjunction of clauses  $(C_1, C_2, C_3)$
- Each clause: disjunction of literals over V

Does there exist an assignment of Boolean values to the variables, V which sets at least one literal in each clause to '1'?

Example: 
$$(a+b+c)(a+c)(a+b+c)$$
 $C_1$ 
 $C_2$ 
 $C_3$ 
 $C_3$ 

#### **DPLL algorithm for SAT**

[Davis, Putnam, Logemann, Loveland 1960,62]

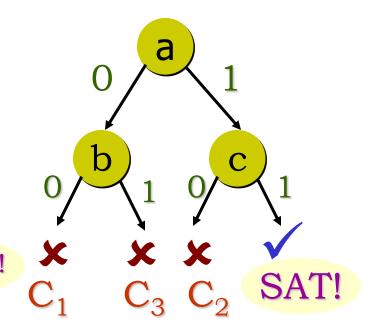
Given: CNF formula  $f(v_1, v_2, ..., v_k)$ , and an ordering function Next\_Variable

Example:

$$(a+b)(\overline{a}+c)(a+\overline{b})$$

$$C_1 \qquad C_2 \qquad C_3$$

$$C_1 \qquad C_2 \qquad C_3$$





#### **DPLL algorithm: Unit clause rule**

Rule: Assign to true any single literal clauses.

$$\begin{pmatrix} (a+b+c) \\ \parallel & \parallel \\ 0 & 0 \end{pmatrix}$$
  $c=1$ 

Apply Iteratively: Boolean Constraint Propagation (BCP)

$$a(\overline{a}+c)(\overline{b}+c)(a+b+\overline{c})(\overline{c}+e)(\overline{d}+e)(c+d+\overline{e})$$

$$c(\overline{b}+c)(\overline{c}+e)(\overline{d}+e)(c+d+\overline{e})$$

$$e(\overline{d}+e)$$



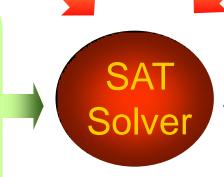
#### **Anatomy of a modern SAT solver**

**DPLL** Algorithm

Efficient BCP

# Clause database management

- Discard useless clauses (e.g. inactive or large clauses)
- Efficient garbage collection



Conflict-driven learning

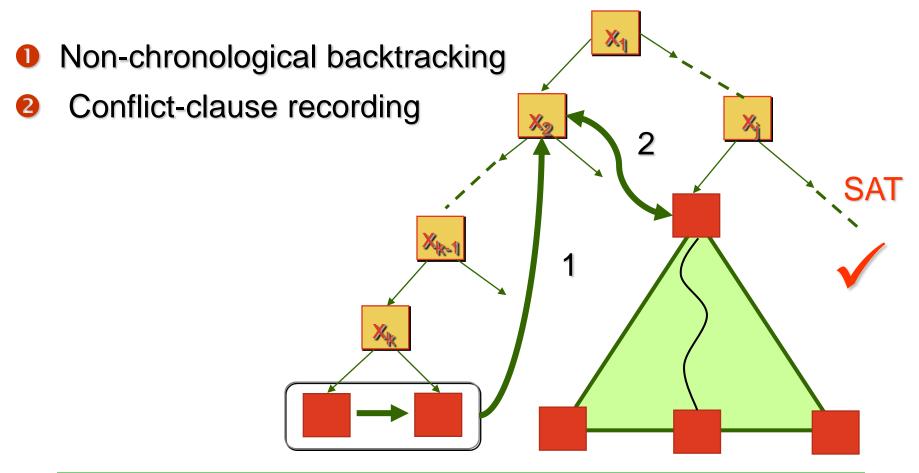
#### Search Restarts

- To correct for bad choices in variable ordering
- Restart algorithm "periodically"
- Retain some/all recorded clauses



#### Conflict driven search pruning (GRASP)

Silva & Sakallah '95



### Variable ordering

- Significantly impacts size of search tree
- Ordering schemes can be static or dymamic
- Conventional wisdom (pre-chaff):
  - Satisfy most number of clauses OR
  - Maximize BCP
  - -e.g. DLIS, MOMs, BOHMs etc.



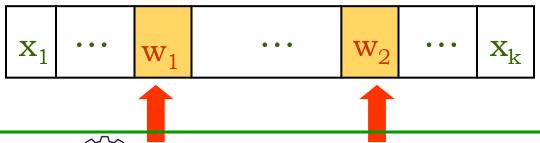
### Variable ordering: New ideas

- New wisdom: Recorded clauses key in guiding search
- Conflict-driven variable ordering:
  - Chaff (DAC'01): Pick var. appearing in *most* number of *recent* conflict clauses
  - BerkMin (DATE'02): Pick var. *involved* in most number of *recent* conflicts
- Semi-static in nature, for efficiency
  - Statistics updated on each conflict
- Side-effect: Better cache behavior



#### **Efficient Boolean Constraint Propagation**

- Observation: BCP almost 80% of compute time, under clause recording
- Traditional implementation:
  - Each clause: Counter for #literals set to false
  - Assgn. to variable 'x': Update all clauses having x,  $\overline{x}$
- New Idea: Only need to monitor event when # free literals in a clause goes from 2 to 1
  - Need to watch only 2 literals per clause : SATO (Zhang'97), Chaff (DAC'01)



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### **SAT solvers today**

#### Capacity:

- Formulas upto a *million variables* and *3-4 million clauses* can be solved in *few hours*
- Only for structured instances e.g. derived from realworld circuits & systems

#### Tool offerings:

- Public domain
  - GRASP : Univ. of Michigan
  - SATO: Univ. of Iowa
  - zChaff: Princeton University
  - BerkMin: Cadence Berkeley Labs.
- Commercial
  - PROVER: Prover Technologies



# Thank you

