

Implementation Verification: Equivalence Checking

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With thanks to Srinivas Devadas, MIT

1

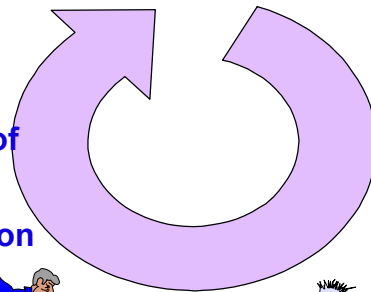
Design Process

Design : specify and
enter the design intent



Verify:

verify the
correctness of
design and
implementation

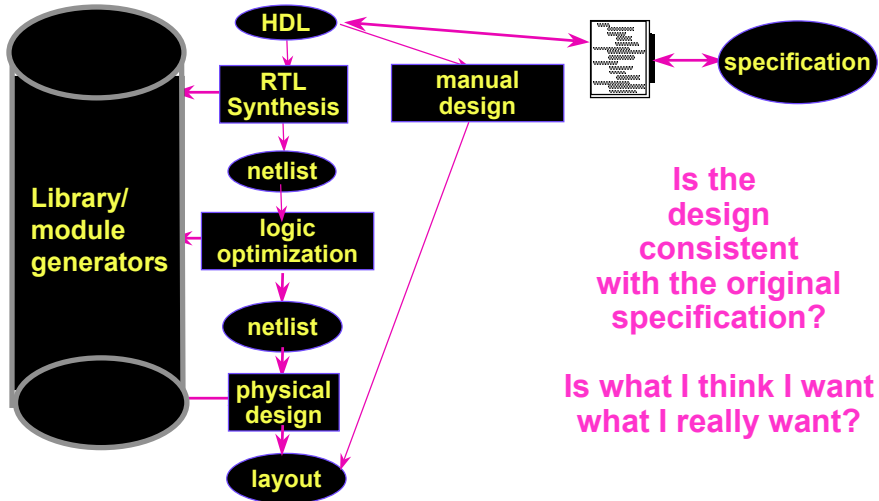


Implement:

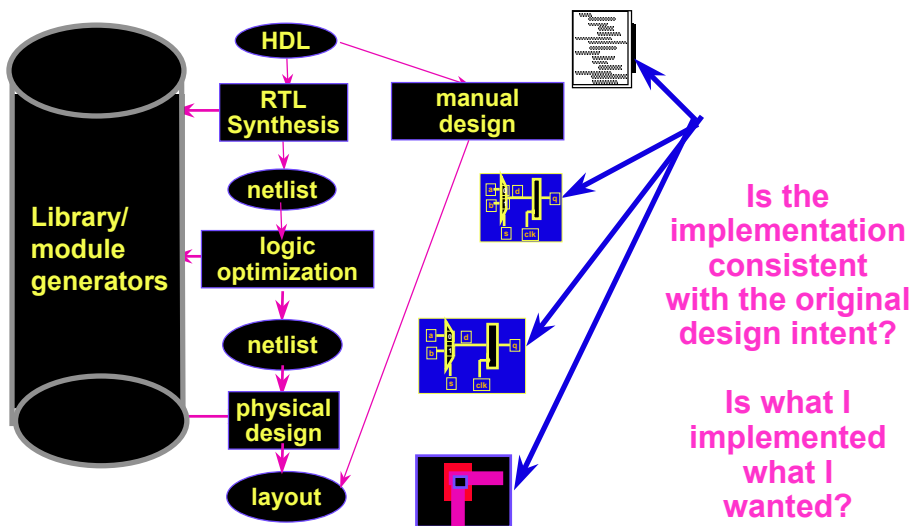
refine the
design
through all
phases



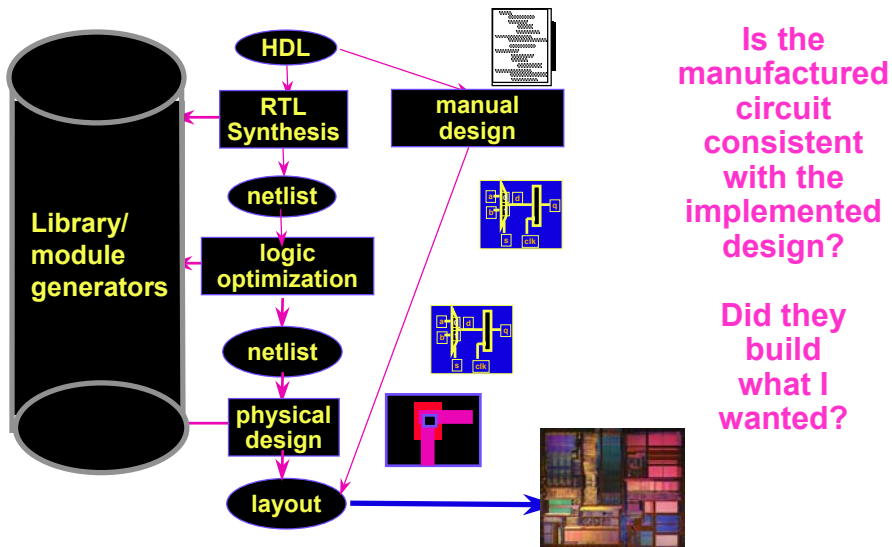
Design Verification



Implementation Verification



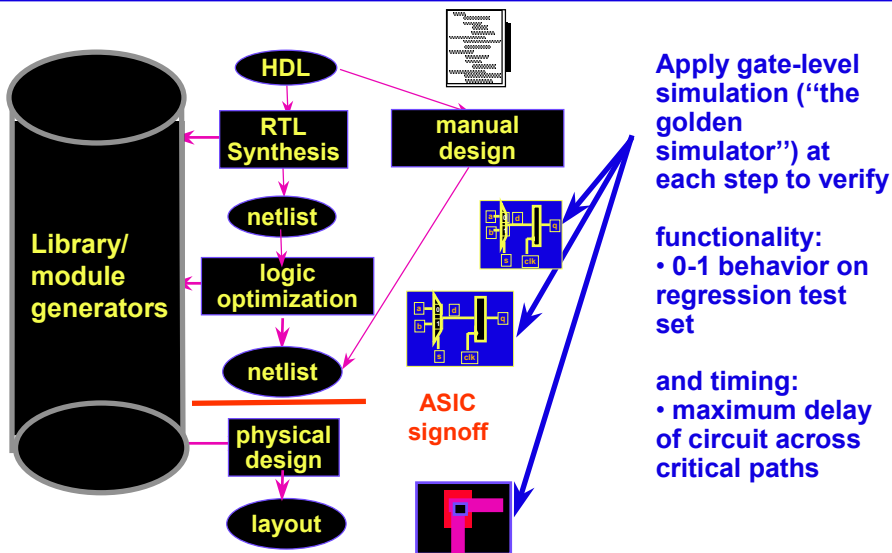
Manufacture Verification (Test)



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5

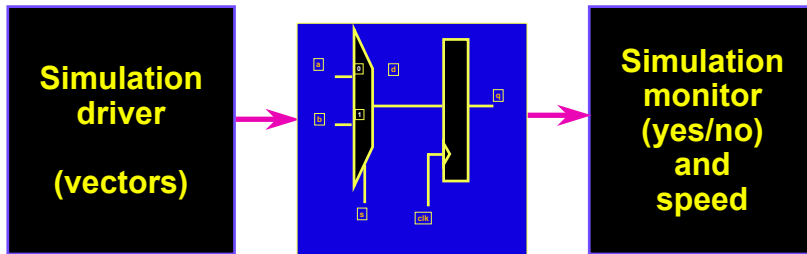
Implementation verification for ASIC's



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6

Software Simulation

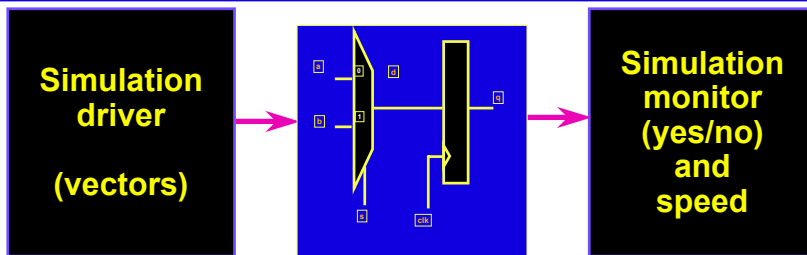


Advantages of gate-level simulation

- verifies timing and functionality simultaneously
- approach well understood by designers

Disadvantages of gate-level simulation?

Software Simulation



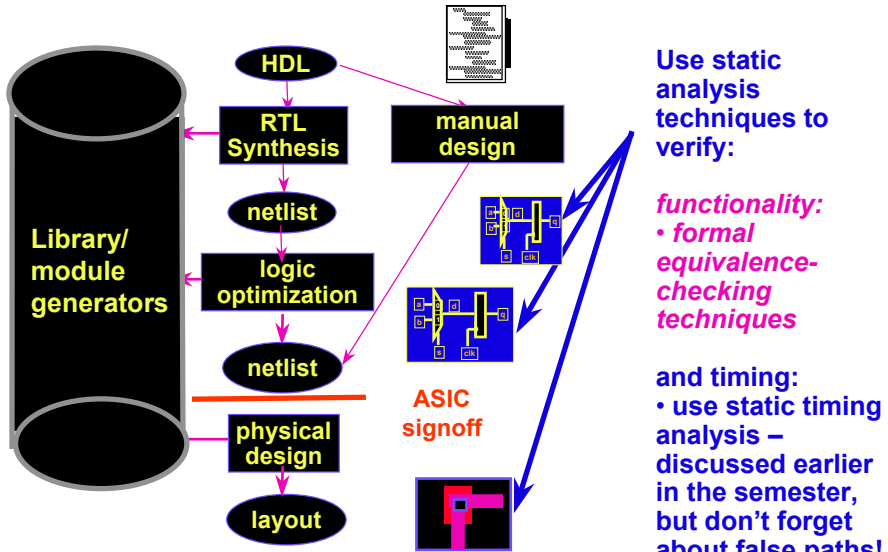
Advantages of gate-level simulation

- verifies timing and functionality simultaneously
- approach well understood by designers

Disadvantages of gate-level simulation?

- computationally intensive - only 1 - 10 clock cycles of 100K gate design per 1 CPU second
- incomplete - results only as good as your vector set - easy to overlook incorrect timing/behavior

Alternative - Static Sign-off



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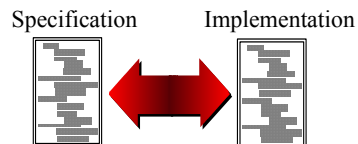
9

Problem: RTL to RTL Verification

After verification RTL may still be modified

– RTL level improvements for :

- performance
- power
- area
- testability



Need to verify that new RTL is correct

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10

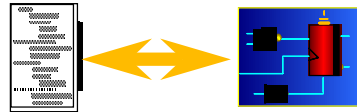
Problem: RTL to Gates Verification

Verify the gate level implementation is consistent with the RTL level design

Errors may have occurred due to

- synthesis (heaven forbid!!)
- manual intervention

HDL Design Implementation



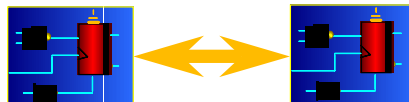
Problem: Gates to Gates Verification

Verify the modified gate level implementation is consistent with the RTL level design

Errors may have occurred due to

- Incorrect synthesis or module generation (heaven forbid!!)
- Test insertion
- Scan chain reordering
- Clock tree synthesis
- Post layout "tweaks"

Netlist Implementation



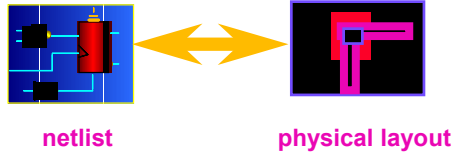
Problem: Layout to Gates Verification (LVS)

Verify the modified gate level implementation
is consistent with the RTL level design

Errors may have occurred due to

- Errors in physical design tools
- Manual changes in layout

Verification is primarily graphical or
"topological"

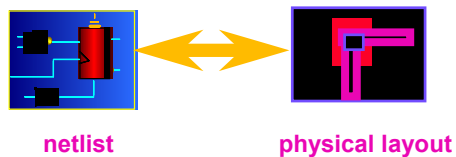


Solving Layout to Gates Verification (LVS)

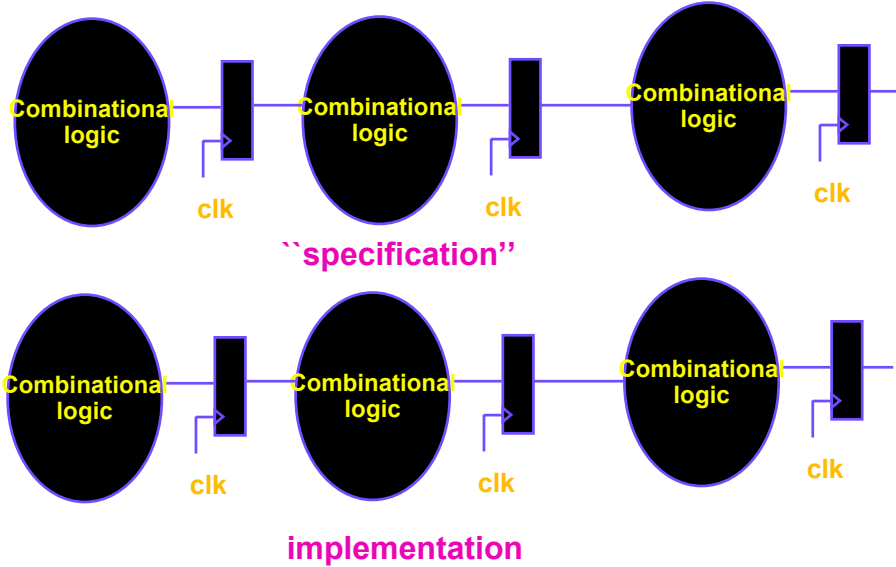
Extract gate level models from physical level

Graphically compare extracted model
against gate-level schematic (layout
versus schematic)

Flag any discrepancies



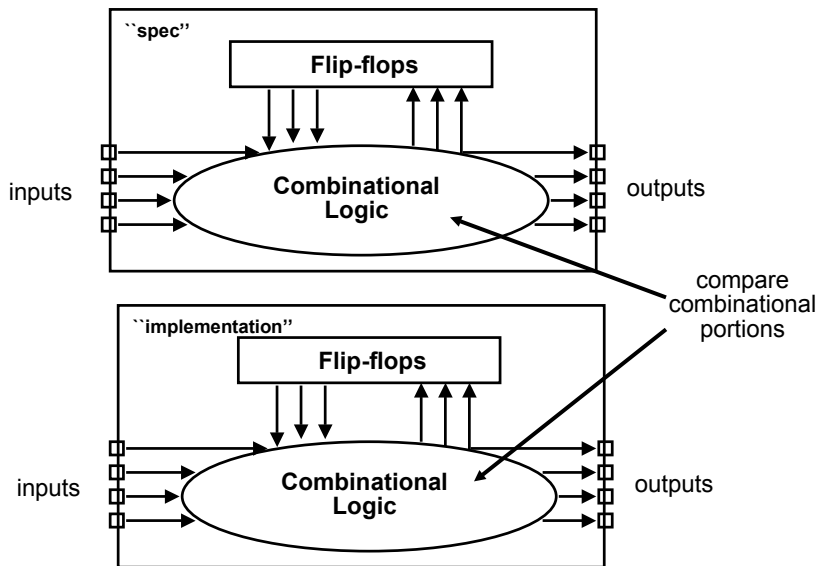
Solving Gates to Gates Verification



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15

Extract combinational portions



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16

Combinational Equivalence Checking

Given combination circuits C1 and C2/(Boolean functions B1 and B2) how can we practically prove that C1 is equivalent to C2?

Combinational Equivalence Checking

Presumes equivalence-relation given (or discovered) between sequential circuits

Approaches

- Reasoning in the propositional calculus/Satisfiability
- Set-theoretic approaches (used in 2-level examples)
- Symbolic simulation (used in 2-level examples)
- Symbolic manipulation
 - graph isomorphism
 - structural reductions
- Canonical forms - BDD's and variants
- Test-oriented methods
 - static, dynamic learning

These techniques form the foundation of modern equivalence checking/implementation verification

2-level circuits

$$(F \Leftrightarrow G) \Leftrightarrow (F \rightarrow G) \bullet (G \rightarrow F)$$
$$\Leftrightarrow (\bar{F} \vee G) \wedge (F \vee \bar{G})$$

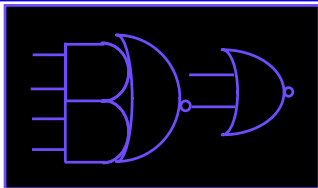
Now, treating F and G as sets of cubes we can check if

$$(\bar{F} \cup G) \cap (F \cup \bar{G}) \Leftrightarrow 1$$

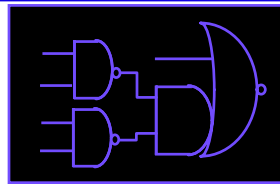
Which is feasible for most 2-level circuits/SOP expressions/DNF formulas

Worked well in the espresso era – doesn't generalize to multilevel

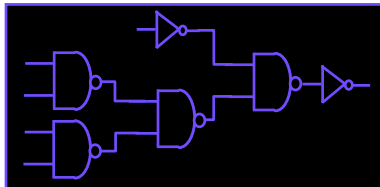
Multilevel: Structural Methods



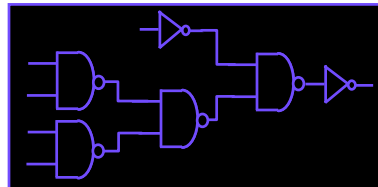
Combinational circuit 1



Combinational circuit 2



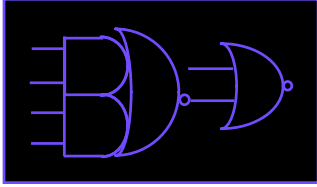
unmapped circuit 1



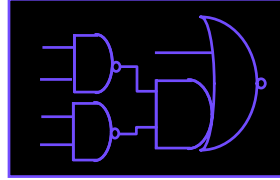
unmapped circuit 2

Compare them as graphs
Looks tough – why?
Turns out to be easy – why?

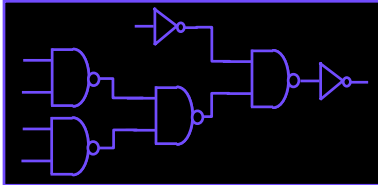
Structural Methods



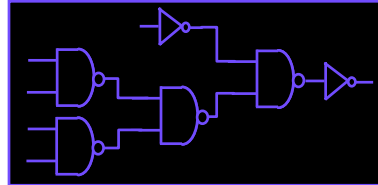
Combinational circuit 1



Combinational circuit 2



unmapped circuit 1



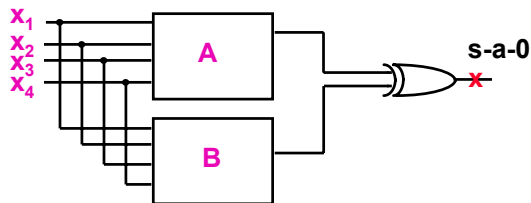
unmapped circuit 2

Compare them as graphs
Looks tough – graph isomorphism
Turns out to be easy – DAGs
This helps but runs out of gas soon.

More powerful: Testing

Given two single-output circuits **A** and **B**

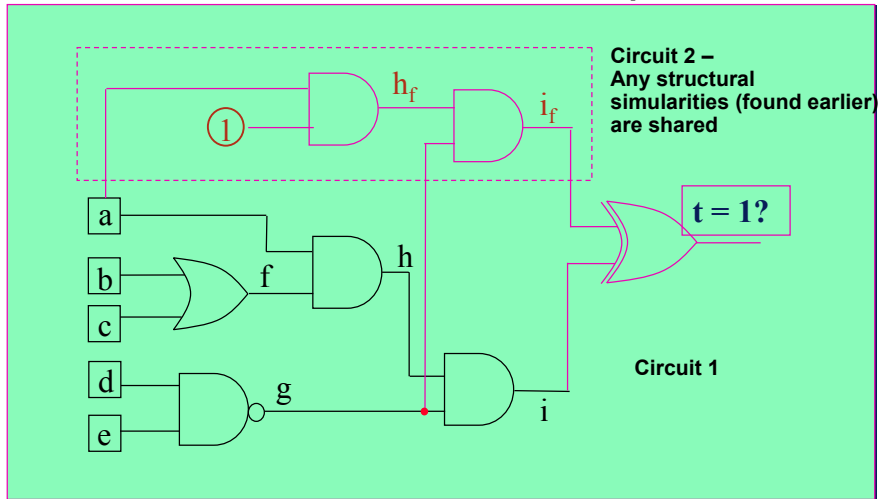
Are **A** and **B** equivalent can be posed as: Is there a test for **F s-a-0**?



If **F s-a-0** is redundant, $A \equiv B$ else test vector produces different outputs for **A** and **B**.

SAT Again

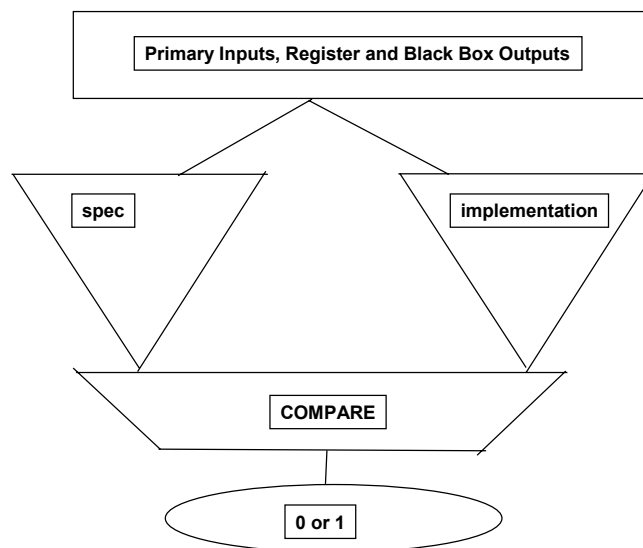
This time ask whether there is an input on which Circuit 1 and Circuit 2 differ? This time we don't expect one!



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23

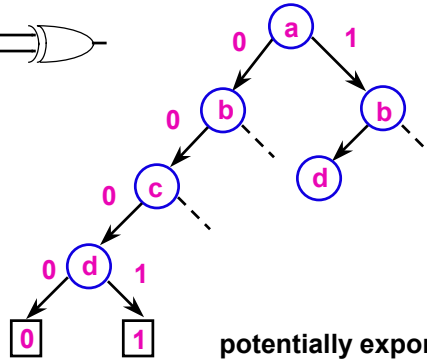
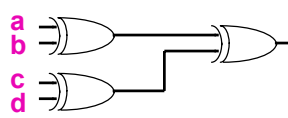
More powerful: Comparison Mitre



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24

Canonical Forms: Binary Decision Tree

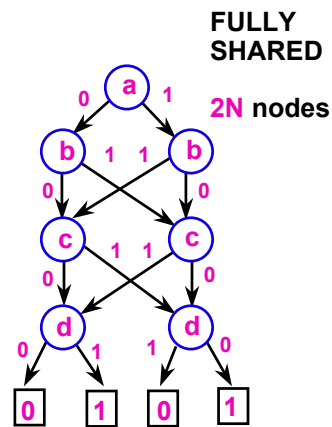
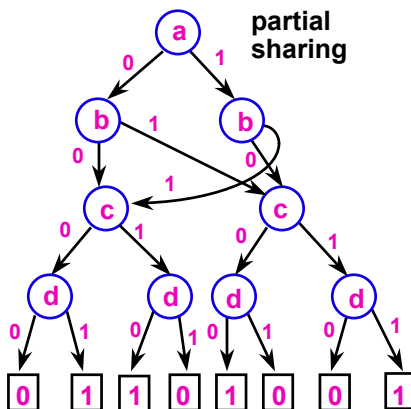


potentially exponential # nodes.

Do not have to store entire set of nodes, but have to enumerate them (slight improvement over two-level tautology).

Decision Graph

Share nodes in tree \Rightarrow graph.



Definition of a Binary Decision Diagram

A Binary Decision Diagram having root vertex v denotes a Boolean function f_v

1. If v is a terminal vertex:

- (a) if $value(v) = 1$, then $f_v = 1$
- (b) if $value(v) = 0$, then $f_v = 0$

2. If v is a nonterminal vertex with $index(v) = n$ then f_v is the function:

$$f_v(x_1, \dots, x_n) = !f_{low(v)}(x_1, \dots, x_{n-1}) + f_{high(v)}(x_1, \dots, x_{n-1})$$

Definition of an Ordered BDD

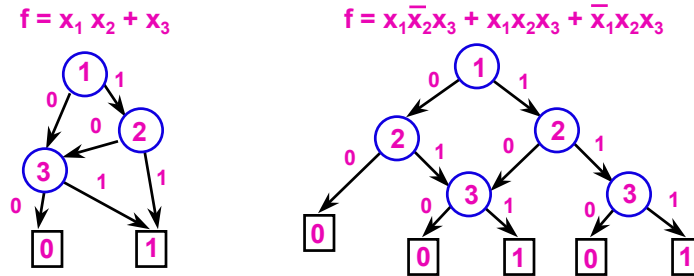
A Binary Decision Diagram is *ordered* iff:

1. If v is a non-terminal vertex:

- (a) if $low(v)$ is a non-terminal then, $index(v) < index(low(v))$ and
- (b) if $high(v)$ is a non-terminal then, $index(v) < index(high(v))$ and

This property implies the property of *freedom* in BDDs: In traversing any path from a vertex in a OBDD to its root then we encounter each decision variable at most once.

Ordered Binary Decision Diagram

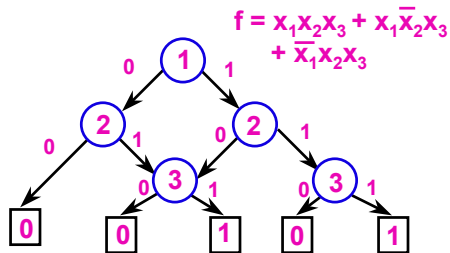


Inputs satisfy ordering restriction. Each node/vertex v in the graph has $\text{index}(v)$. Two children are $\text{low}(v)$ and $\text{high}(v)$. $\bar{0}$ and $\bar{1}$ are terminal vertices, others are non-terminal.

$$\begin{aligned} \text{index}(v) &< \text{index}(\text{low}(v)) && \text{for all } v \\ \text{index}(v) &< \text{index}(\text{high}(v)) \end{aligned}$$

Ordered BDDs Enough?

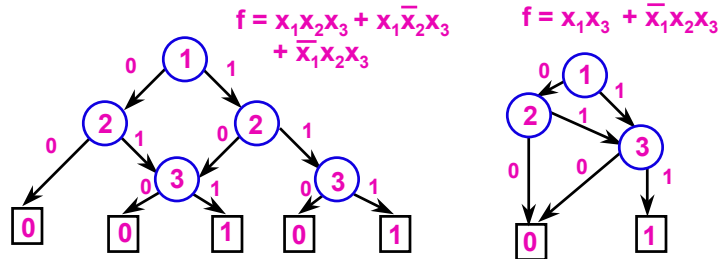
Storage is always a problem for Ordered Binary Decision Diagram (OBDD) can we simplify them further?



Reduced, Ordered BDDs

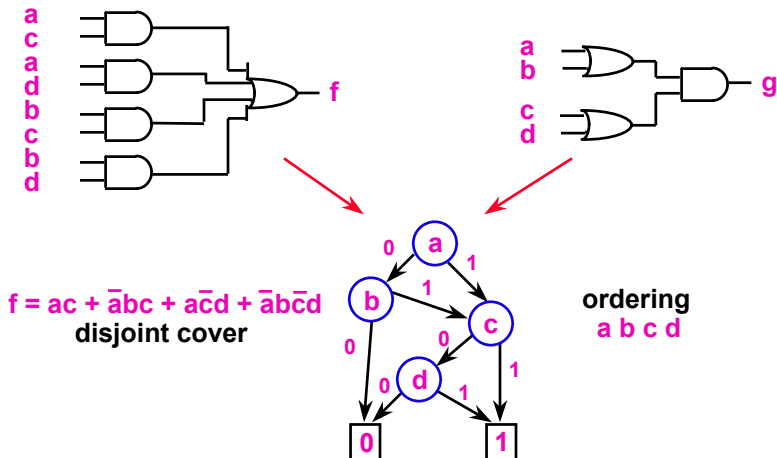
An Ordered Binary Decision Diagram (OBDD) may still have "redundant" vertices.

Definition: An OBDD is reduced, if it contains no vertex v with $\text{low}(v) = \text{high}(v)$, nor does it contain distinct vertices v and v' such that the subgraphs rooted by v and v' are isomorphic.



Can reduce an OBDD in $O(|G| \log |G|)$ time.

Some Properties of a ROBDD



Proof that ROBDDs are canonical - 1

Theorem (R. Bryant): If G, G' are ROBDD's of a Boolean function f with k inputs then G and G' are identical.

Base Case: $i=0$. f has 0 inputs.

f can be the 0 or 1 ROBDD.

In either case G and G' are identical.

Induction Hypothesis: Suppose that for any Boolean function f with $i < k$ inputs then if H, H' are each ROBDD, with the same ordering, of the Boolean function f then H, H' are identical.

Let G, G' be ROBDDs for f under the same ordering.

Let x_i be the input with lowest index (i.e. the root of the ROBDD) in the ROBDDs G, G'

Proof that ROBDDs are canonical -2

By hypothesis, $f_0 \equiv f_0' \quad f_1 \equiv f_1'$.

Let us consider a number of cases regarding sharing between f_0, f_1 , and f_0', f_1'

If there is no sharing of vertices between f_0, f_1 and f_0', f_1' , then ...



Proof that ROBDDs are canonical -2

By hypothesis, $f_0 \equiv f_0'$ $f_1 \equiv f_1'$.

Let us consider a number of cases regarding sharing between f_0 , f_1 , and f_0' , f_1'

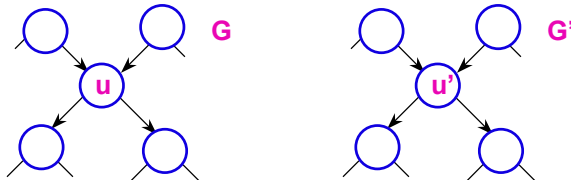
If there is no sharing of vertices between f_0 , f_1 and f_0' , f_1' , then G is identical to G' .



f_0 , f_0' identical
 f_1 , f_1' identical
 x_i identical

Proof that ROBDDs are canonical - 3

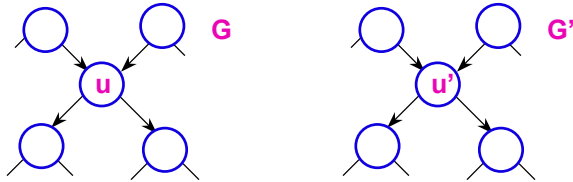
Suppose a vertex u is shared across f_0 , f_1 .



Then if there is a corresponding single u' shared in f_0' , f_1' then G , and G' are identical.

Proof that ROBDDs are canonical - 3

Suppose a vertex u is shared across f_0, f_1 .

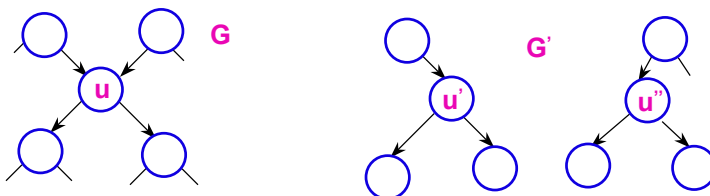


Then if there is a corresponding single u' shared in f_0', f_1' then G , and G' are identical.

By the induction hypothesis the
bdd rooted in u, u' are the
same

Proof that ROBDDs are canonical – 4a

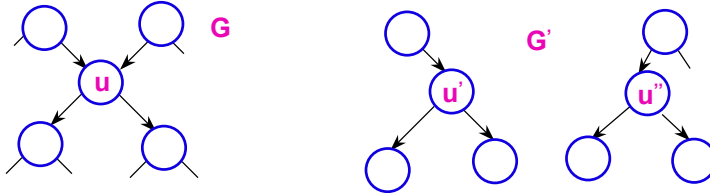
Alternatively, if u in G is realized as two (or more) vertices u', u'' , in G' , then G, G' are not identical:



What about this case?

Proof that ROBDDs are canonical – 4b

Alternatively, if u in G is realized as two (or more) vertices u', u'' , in G' , then G, G' are not identical:



But the ROBDDs rooted at u', u'' both realize the same Boolean function with the same ordering.
So G' is not reduced because there are two such vertices in G' . But this contradicts the assumption that G, G' are each ROBDDs.

Therefore, in each case G is identical to G' . Therefore ROBDDs are a canonical representation.

ROBDDs are Canonical - use 1

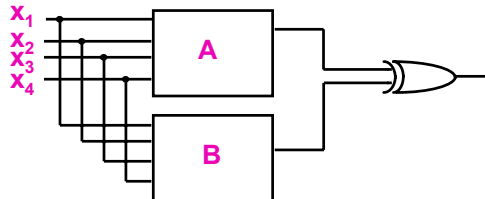
Given an ordering, a logic function has a unique ROBDD.

Given two circuits, *checking their equivalence* reduces to a Directed Acyclic Graph isomorphism check between their respective ROBDDs

- can be done in linear time in $|G_1| (= |G_2|)$.
- constructing ROBDD for a given function and ordering could take exponential time.

ROBDD - approach 2

Given two single-output circuits **A** and **B**

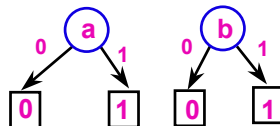
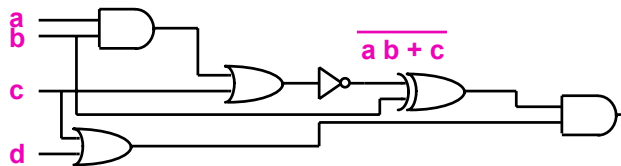


What is the ROBDD of this function?
 If 0 then circuits **A** and **B** are equivalent
 Else they are not

ROBDD Construction

Given ordering and multilevel network.

ROBDD of $a b$



Begin with ROBDDs
for primary inputs

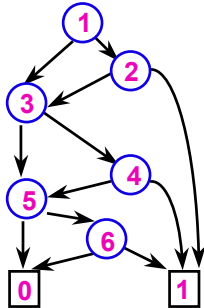
Proceed through network, constructing the ROBDD for
each gate output, by applying the gate operator to the
ROBDDs of the gate inputs

Sensitivity to Ordering

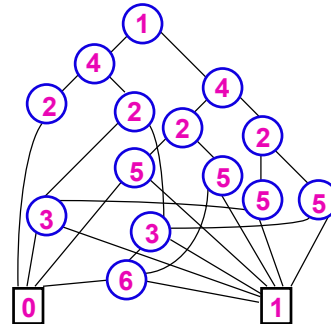
Given a function with n inputs, one input ordering may require exponential # vertices in ROBDD, while other may be linear in size.

$$f = x_1 x_2 + x_3 x_4 + x_5 x_6$$

$x_1 x_2 x_3 x_4 x_5 x_6$



$x_1 x_4 x_2 x_5 x_3 x_6$



Summary of ROBDD checking procedure

Given circuits C1 and C2 to be verified for equivalence

A1) create the "comparison mitre" circuit D1

A2) find a variable ordering for the ROBDD for D1

A3) build the ROBDD and check for 0

or

B1) find a variable ordering for the ROBDD's of C1, C2

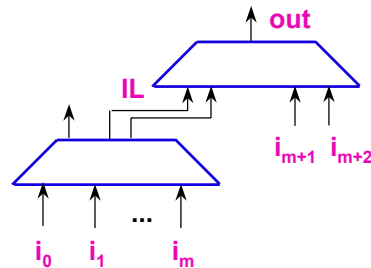
B2) build the ROBDD for each of C1, C2

B3) Check to see that the DAGs are isomorphic

Heuristic Input Ordering

BDD can be viewed as a multiplexor-based multilevel circuit.

Look at an (optimized) multilevel network and decide ordering for the BDD.



order i_{m+1}, i_{m+2}
after i_0, i_1, \dots, i_m
since IL appear to be
a good “encoding”
for i_0, i_1, \dots, i_m

Generalize to multiple levels.

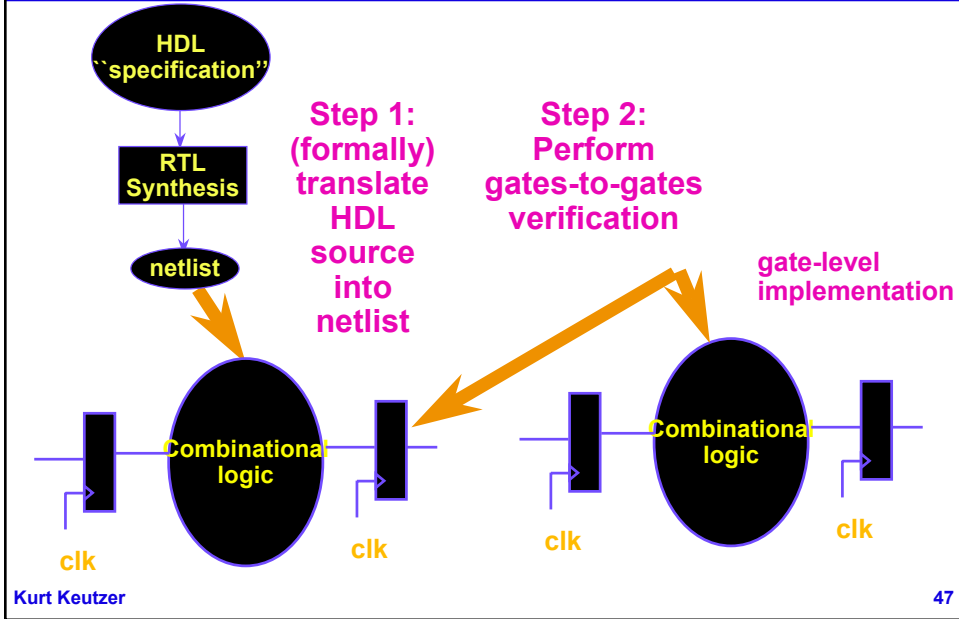
Resolve “conflicts” heuristically.

Putting it all together

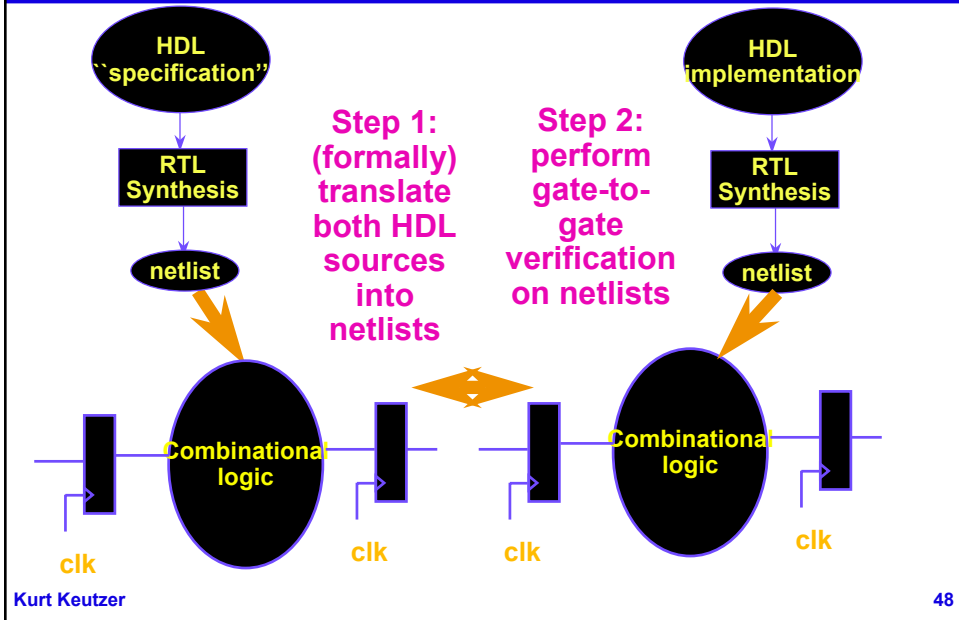
Current formula requires:

- Ability to associate FF's from the two circuits
- Exploiting structural similarity/check-points
- Applying whatever works:
 - Test techniques, SAT for more regular structures
 - BDD for more random
 - Mix and match

Solving RTL-to-Gates Verification



Solving RTL-to-RTL Verification



Current status of equivalence checking

Equivalence checking is one of the great successes of EDA in the late 90's

Equivalence checkers are now able to routinely verify complex (>10M gate) integrated circuit designs

Coupled with static timing analysis it has enabled "static-signoff"

Current technology leaders are Encounter Conformal from Cadence (Verplex) and Formality from Synopsys. Good proprietary (e.g. IBM/verity) solutions exist

Static sign-off methodology more widely used

Successful equivalence checkers must orchestrate a number of different approaches

- syntactic equivalence
- automatic test pattern generation-like approaches
- BDD-based techniques
- pattern-reduction methods

A few open problems remain

retimed circuits

49

Open problems in implementation verification

More robust equivalence checking

Verification of equivalence between sequential circuits in which there is no obvious register-equivalence

- retimed circuits
- circuits with differing state assignments

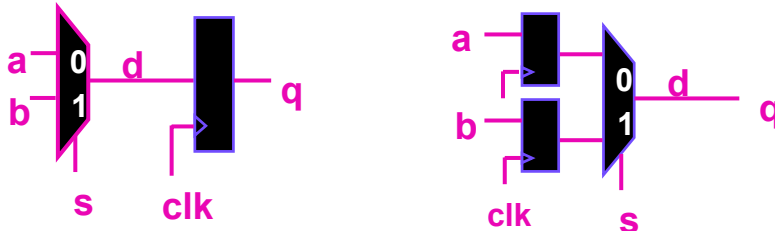
Better diagnostics when circuits are not equivalent

Implementation verification between RTL and behavioral models

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50

Retimed circuits



Circuits are equivalent (modulo some initial state issues) but it is not possible to show that they are equivalent using Boolean equivalence

Encoding Problems

Some logic specifications are “symbolic” rather than binary-valued

e.g. specification for an ALU

<u>Symbol</u>	<u>Operation</u>
ADD	+
SUB	-
XOR	Exclusive-OR
INC	Increment

Can assign any binary code to the symbolic values, so long as they are different

Different State Encodings

Circuit 1

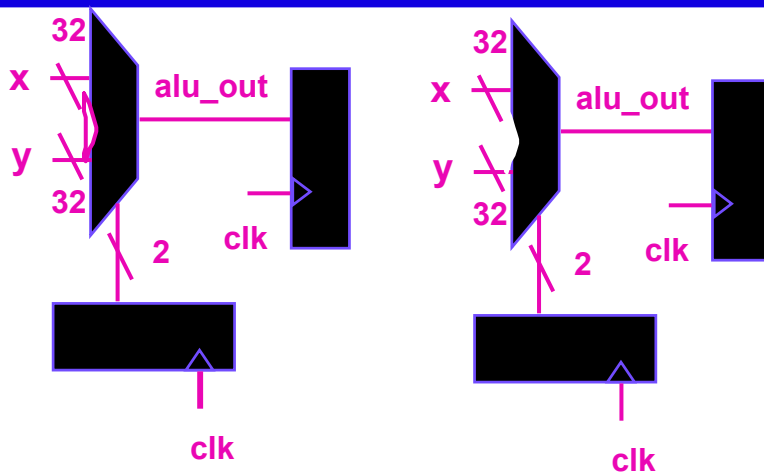
<u>Symbol</u>	<u>Operation</u>
ADD	00
SUB	01
XOR	10
INC	11

Circuit 2

<u>Symbol</u>	<u>Operation</u>
ADD	11
SUB	10
XOR	00
INC	01

Different state encodings make circuits no longer amenable to combinational logic equivalence checking

Different Encodings



ALU "ADD"s on 00

ALU "ADD"s on 11

Extras

Building ROBDD: Procedure Apply

Compute $f_1 \langle \text{op} \rangle f_2$

$\langle \text{op} \rangle$ can be AND, OR, XOR, XNOR, etc.

To apply the operator to the ROBDDs represented by f_1 and f_2

1) If v_1 and v_2 are terminal vertices, simply generate a terminal vertex u with

$$\text{value}(u) = \text{value}(v_1) \langle \text{op} \rangle \text{value}(v_2)$$

2) Else if $\text{index}(v_1) = \text{index}(v_2) = i$

Call algorithm *apply* recursively on $\text{low}(v_1)$ and $\text{low}(v_2)$ to generate a new vertex u , $\text{low}(u)$, $\text{high}(v_1)$ and $\text{high}(v_2)$ to generate $\text{high}(u)$, after creating vertex u , $\text{index}(u) = i$

Procedure Apply - 2

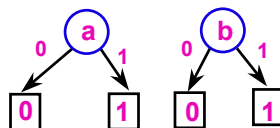
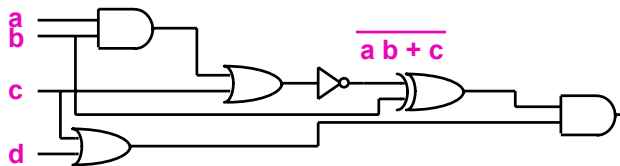
- 3) If $\text{index}(v_1) = i$, but $\text{index}(v_2) > i$, then create a new vertex u having index i , and apply algorithm recursively on $\text{low}(v_1)$ and v_2 to generate $\text{low}(u)$, and on $\text{high}(v_1)$ and v_2 to generate $\text{high}(u)$.
- 4) If $\text{index}(v_2) = i$, but $\text{index}(v_1) > i$, then create a new vertex u having index i , and apply algorithm recursively on $\text{low}(v_2)$ and v_1 to generate $\text{low}(u)$, and on $\text{high}(v_2)$ and v_1 to generate $\text{high}(u)$.

$O(G_1 \cdot G_2)$ complexity (though recursive).
 “Multiplying” the two graphs.

ROBDD Construction - 1

Given ordering and multilevel network.

ROBDD of $a b$

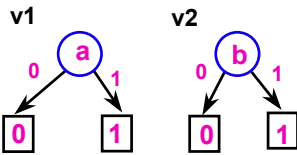
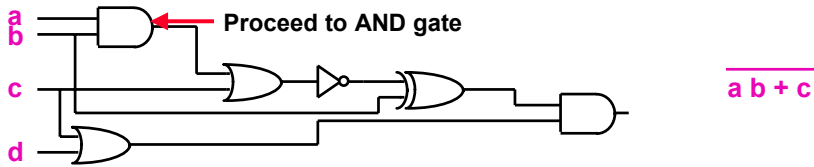


Begin with ROBDDs
for primary inputs

Proceed through network, constructing the ROBDD for each gate output, by applying the gate operator to the ROBDDs of the gate inputs

ROBDD Construction – 2a

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.

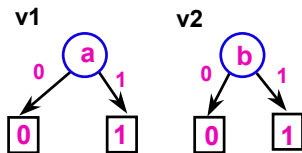
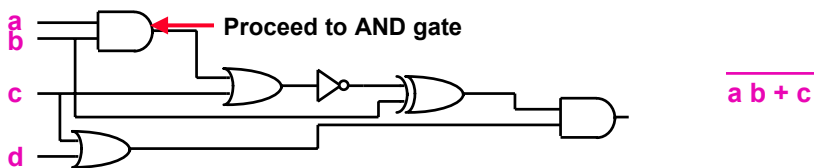


Build ROBDD of $a * b$ using apply

If $\text{index}(v_1) = i$, but $\text{index}(v_2) > i$, then create a new vertex u having index i , and apply algorithm recursively on $\text{low}(v_1)$ and v_2 to generate $\text{low}(u)$, and on $\text{high}(v_1)$ and v_2 to generate $\text{high}(u)$.

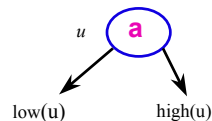
ROBDD Construction – 2c

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



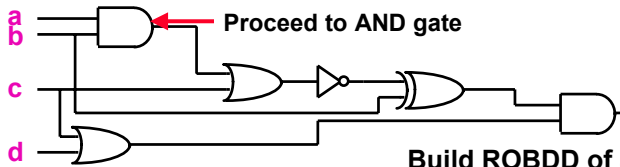
Build ROBDD of $a * b$ using apply

If $\text{index}(v_1) = i$, but $\text{index}(v_2) > i$, then **create a new vertex u having index i** , and apply algorithm recursively on $\text{low}(v_1)$ and v_2 to generate $\text{low}(u)$, and on $\text{high}(v_1)$ and v_2 to generate $\text{high}(u)$.



ROBDD Construction – 2d

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.

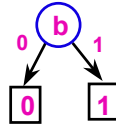


v1



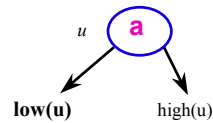
AND

v2



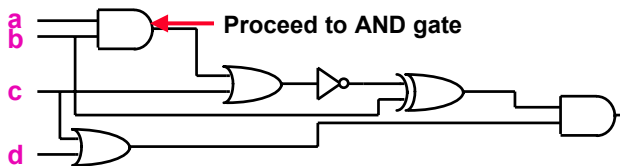
Build ROBDD of $a * b$ using apply

If $\text{index}(v_1) = i$, but $\text{index}(v_2) > i$, then create a new vertex u having index i , and apply algorithm recursively on $\text{low}(v_1)$ and v_2 to generate $\text{low}(u)$, and on $\text{high}(v_1)$ and v_2 to generate $\text{high}(u)$.



ROBDD Construction – 3a

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.

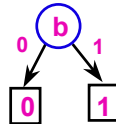


v1



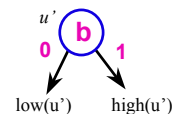
AND

v2



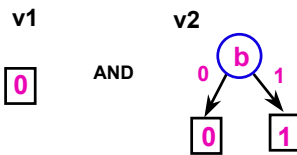
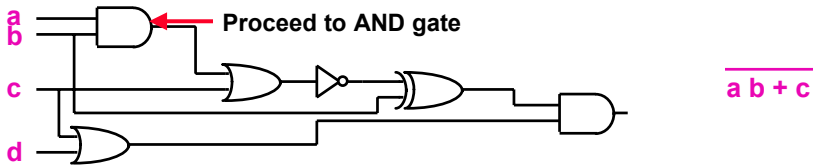
Build ROBDD of $a * b$ using apply

If $\text{index}(v_2) = i$, but $\text{index}(v_1) > i$, then create a new vertex u' having index i , and apply algorithm recursively on $\text{low}(v_2)$ and v_1 to generate $\text{low}(u')$, and on $\text{high}(v_2)$ and v_1 to generate $\text{high}(u')$.



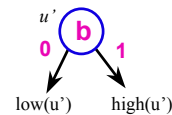
ROBDD Construction – 3b

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



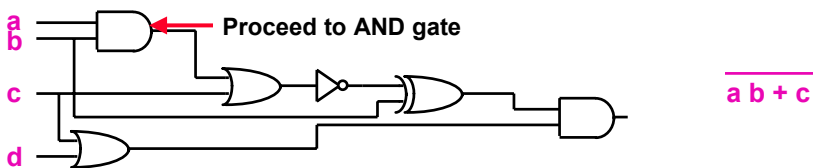
Build ROBDD of $a * b$ using apply

If $\text{index}(v_2) = i$, but $\text{index}(v_1) > i$, then create a new vertex u' having index i , and apply algorithm recursively on $\text{low}(v_2)$ and v_1 to generate $\text{low}(u')$, and on $\text{high}(v_2)$ and v_1 to generate $\text{high}(u')$.



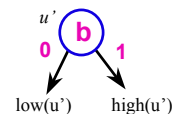
ROBDD Construction – 3c

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



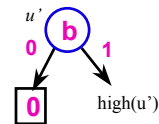
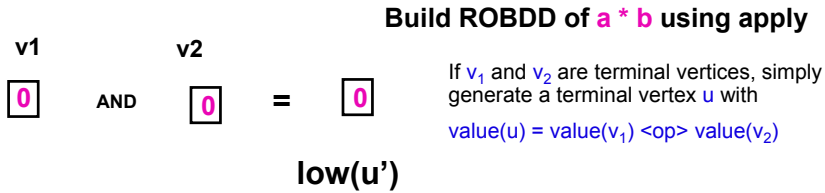
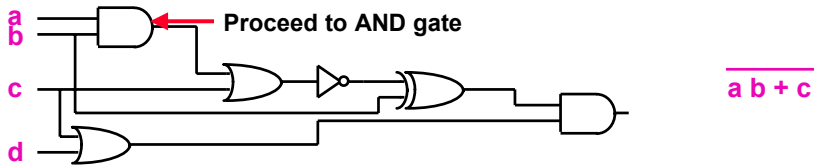
Build ROBDD of $a * b$ using apply

If $\text{index}(v_2) = i$, but $\text{index}(v_1) > i$, then create a new vertex u' having index i , and apply algorithm recursively on $\text{low}(v_2)$ and v_1 to generate $\text{low}(u')$, and on $\text{high}(v_2)$ and v_1 to generate $\text{high}(u')$.



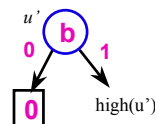
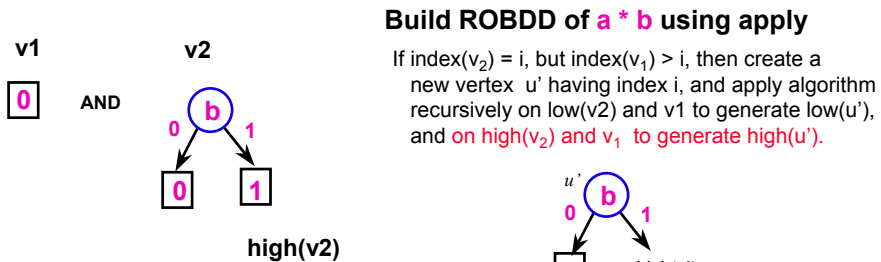
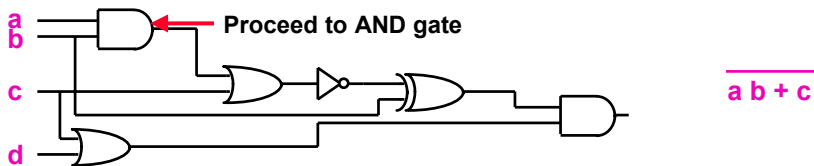
ROBDD Construction – 3d

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



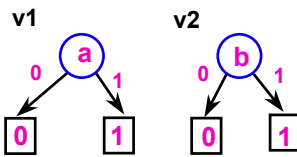
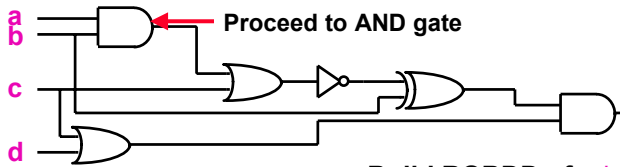
ROBDD Construction – 3e

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



ROBDD Construction – 4a

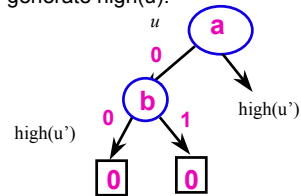
Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



Build ROBDD of $a * b$ using apply

After returning from recursion:

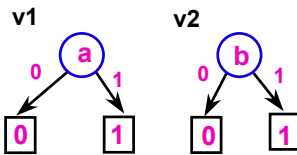
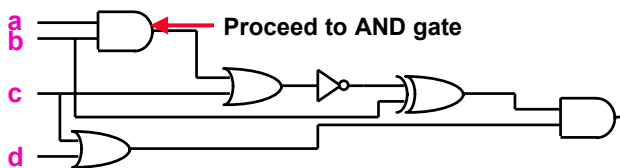
If $\text{index}(v_1) = i$, but $\text{index}(v_2) > i$, then create a new vertex u having index i , and apply algorithm recursively on $\text{low}(v_1)$ and v_2 to generate $\text{low}(u)$, and on $\text{high}(v_1)$ and v_2 to generate $\text{high}(u)$.



computing $\text{low}(u)$

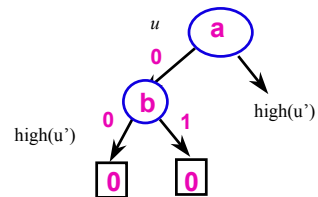
ROBDD Construction – 4b

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



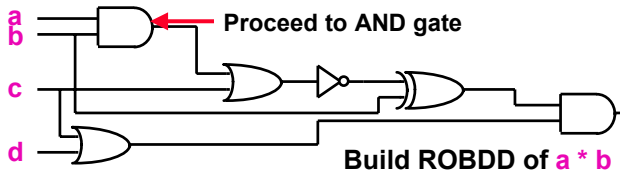
Build ROBDD of $a * b$ using apply

If $\text{index}(v_1) = i$, but $\text{index}(v_2) > i$, then create a new vertex u having index i , and apply algorithm recursively on $\text{low}(v_1)$ and v_2 to generate $\text{low}(u)$, and on $\text{high}(v_1)$ and v_2 to generate $\text{high}(u)$.



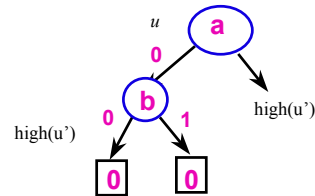
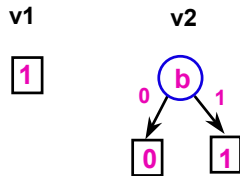
ROBDD Construction – 4c

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



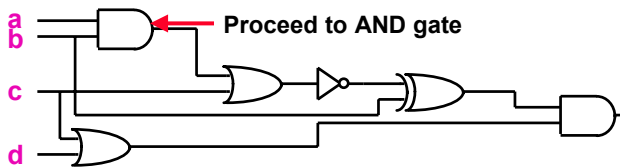
Build ROBDD of $a * b$ using apply

After returning from recursion:
If $\text{index}(v_1) = i$, but $\text{index}(v_2) > i$, then create a new vertex u having index i , and apply algorithm recursively on $\text{low}(v_1)$ and v_2 to generate $\text{low}(u)$, and on $\text{high}(v_1)$ and v_2 to generate $\text{high}(u)$.



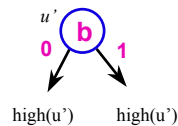
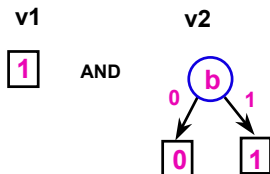
ROBDD Construction – 4d

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



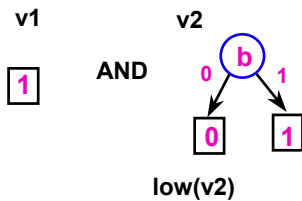
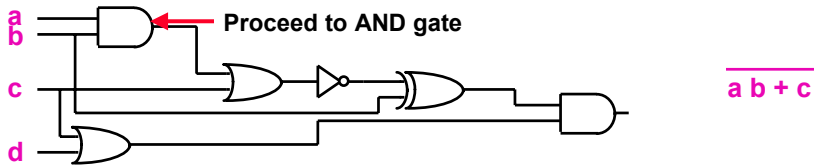
Build ROBDD of $a * b$ using apply

If $\text{index}(v_2) = i$, but $\text{index}(v_1) > i$, then create a new vertex u' having index i , and apply algorithm recursively on $\text{low}(v_2)$ and v_1 to generate $\text{low}(u')$, and on $\text{high}(v_2)$ and v_1 to generate $\text{high}(u')$.



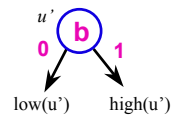
ROBDD Construction – 4e

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



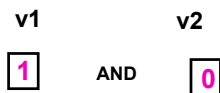
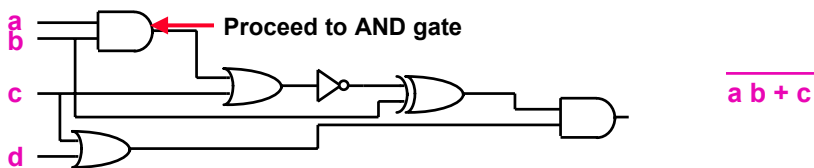
Build ROBDD of $a * b$ using apply

If $\text{index}(v_2) = i$, but $\text{index}(v_1) > i$, then create a new vertex u' having index i , and **apply algorithm recursively on $\text{low}(v_2)$ and v_1 to generate $\text{low}(u')$** , and on $\text{high}(v_2)$ and v_1 to generate $\text{high}(u')$.



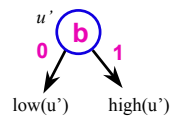
ROBDD Construction – 4f

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



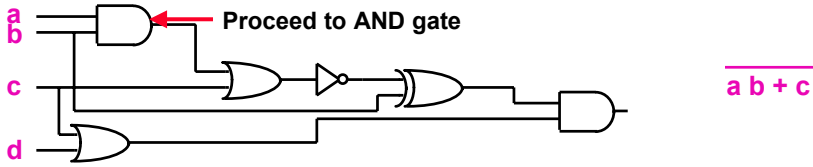
Build ROBDD of $a * b$ using apply

If $\text{index}(v_2) = i$, but $\text{index}(v_1) > i$, then create a new vertex u' having index i , and **apply algorithm recursively on $\text{low}(v_2)$ and v_1 to generate $\text{low}(u')$** , and on $\text{high}(v_2)$ and v_1 to generate $\text{high}(u')$.

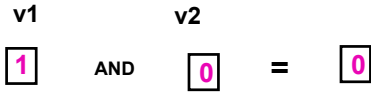


ROBDD Construction – 4g

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.

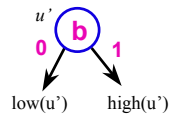


Build ROBDD of $a * b$ using apply



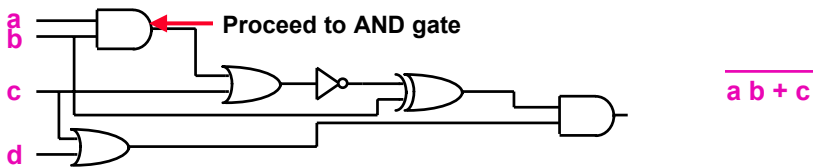
If v_1 and v_2 are terminal vertices, simply generate a terminal vertex u with $value(u) = value(v_1) \langle op \rangle value(v_2)$

$low(u')$

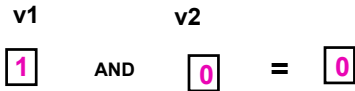


ROBDD Construction – 4h

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.

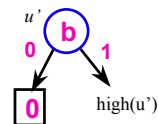


Build ROBDD of $a * b$ using apply



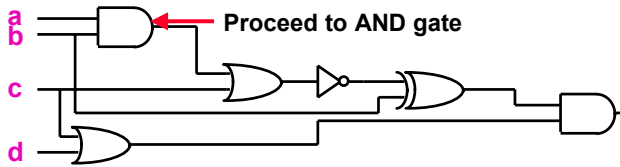
If v_1 and v_2 are terminal vertices, simply generate a terminal vertex u with $value(u) = value(v_1) \langle op \rangle value(v_2)$

$low(u')$

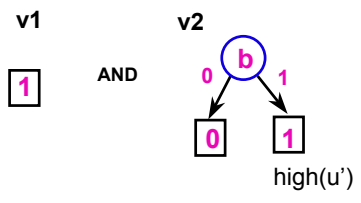


ROBDD Construction – 4i

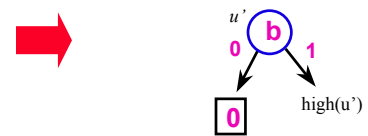
Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



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

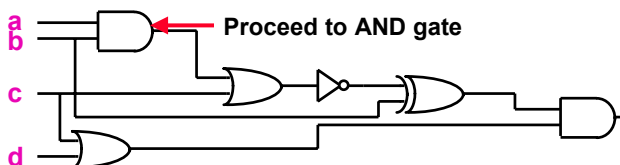


Build ROBDD of $a * b$ using apply
 If $\text{index}(v_2) = i$, but $\text{index}(v_1) > i$, then create a new vertex u' having index i , and apply algorithm recursively on $\text{low}(v_2)$ and v_1 to generate $\text{low}(u')$, and on $\text{high}(v_2)$ and v_1 to generate $\text{high}(u')$.



ROBDD Construction – 4j

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



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

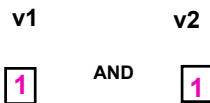
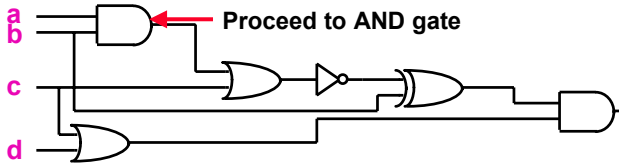


Build ROBDD of $a * b$ using apply
 If v_1 and v_2 are terminal vertices, simply generate a terminal vertex u with
 $\text{value}(u) = \text{value}(v_1) \langle \text{op} \rangle \text{value}(v_2)$



ROBDD Construction – 4k

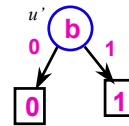
Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



Build ROBDD of $a * b$ using apply

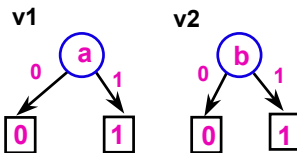
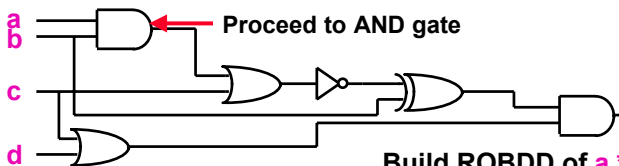
If v_1 and v_2 are terminal vertices, simply generate a terminal vertex u with

$$\text{value}(u) = \text{value}(v_1) \text{ AND } \text{value}(v_2)$$



ROBDD Construction – 4l

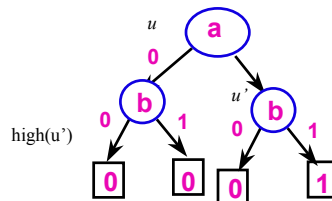
Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.



Build ROBDD of $a * b$ using apply

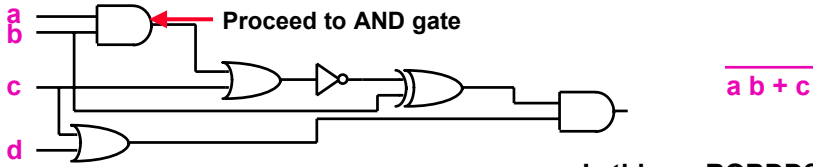
After returning from recursion:

If $\text{index}(v_1) = i$, but $\text{index}(v_2) > i$, then create a new vertex u having index i , and apply algorithm recursively on $\text{low}(v_1)$ and v_2 to generate $\text{low}(u)$, and on $\text{high}(v_1)$ and v_2 to generate $\text{high}(u)$.

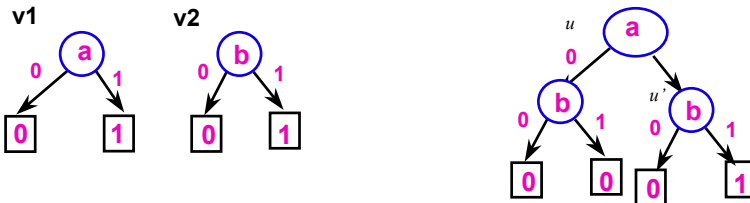


ROBDD Construction – 4m

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.

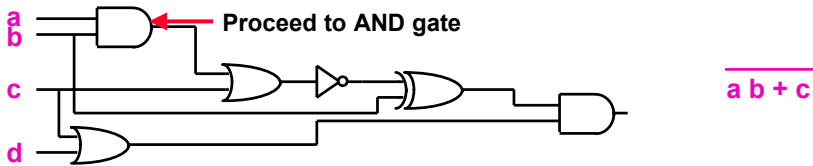


Is this an ROBDD?

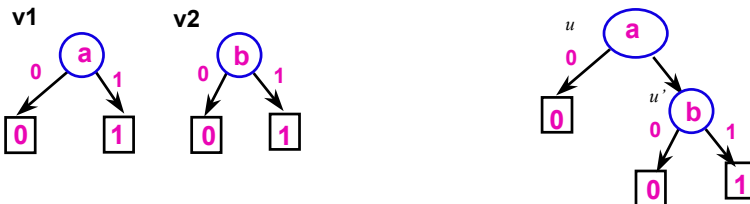


ROBDD Construction – 4n

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.

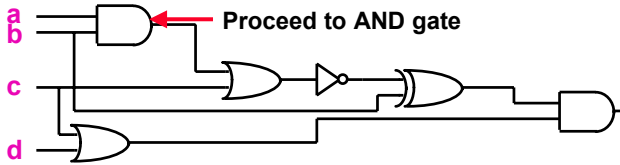


Reduce



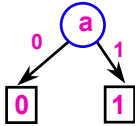
ROBDD Construction - 5

Given ordering $\langle\langle a,1 \rangle, \langle b,2 \rangle, \langle c,3 \rangle, \langle d,4 \rangle, \langle 0,100 \rangle, \langle 1,100 \rangle\rangle$ and multilevel network.

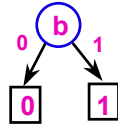


$$\overline{a b + c}$$

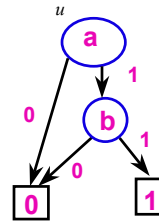
v1



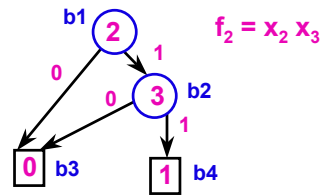
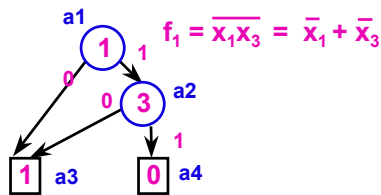
v2



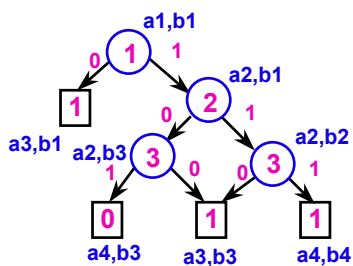
Reduce



Example OR'ing of ROBDDs



New created graph



After reduction

