# BDD MODEL CHECKING 

BINARY DECISION DIAGRAMS

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## Basic Model Checking Problem

System describe by states.
Basic approach : represent each state individually.
$\rightarrow$ Problem, size of the state space increases exponentially.
$\rightarrow$ State Space Explosion.

- Need too much memory;
- Need too much time.


## One solution

## Symbolic model checking :

-Idea: represent set of states by Boolean formula over Boolean variables.

$$
f: \mathrm{Bool}^{n} \rightarrow \mathrm{Bool}
$$

-Need efficient representation and manipulation for state sets and transition relation.
$\rightarrow$ Use Binary Decision Diagrams

## Binary Decision Trees

- Directed acyclic graphs.
- One or two Terminal nodes / Leaves: labelled with 0 or 1 ;
- Set of variables nodes u of out-degree two: -Non-Terminal nodes: each are labelled with a variable var(u);
-Branches / Children: low(v) / high(v), correspond to assignment of 0 or 1 for the variable in the node


## Example of BDT



$$
a \wedge(\neg b \vee c)
$$

Dashed lines denote low-branches, solid lines high-branches

## Problems

-Still exponential;
-Several BDT can verify the same formula.


## BASICS BDD PROPERTIES

To move from BDT to BDD:
$\rightarrow$ Merge terminal nodes;
Ordered BDD (OBDD):
$\Rightarrow$ Define a variable ordering: on all paths from root to leafs, variables appear in same order, without repetitions (there exists a global ordering of variables).

## Example of OBDD


$a \wedge(\neg b \vee c)$ with ordering $a<b<c$

## Reduced Ordered BDD (1)

Uniqueness: no two distinct nodes $v$ and $w$ have the same variable name and low- and high- children.
$\Rightarrow$ Merge isomorphic subgraphs;
Non-redundant tests: No variable node v has identical low- and high- children.
$\Rightarrow$ Remove redundancy.

## Merge isomorphic subgraphs


$a \wedge(\neg b \vee c)$

## Remove redundancy


$a \wedge(\neg b \vee c)$

## ROBDD (2)

Canonical (unique) representation of a Boolean formula for a particular variable order:
For every function $\mathrm{f}: \mathrm{Bool}^{\mathrm{n}} \rightarrow$ Bool and variable ordering $\mathrm{x}_{1}<\mathrm{x}_{2}<\cdots<\mathrm{x}_{\mathrm{n}}$, there exists exactly one ROBDD representing this function.
Equivalence checking in linear time, and satisfiability checking in constant time.

Most of time, we will refer to ROBDD simply as BDDs.

## Sensitivity to Variable Ordering (1)


$(\mathrm{a} 1 \wedge \mathrm{~b} 1) \vee(\mathrm{a} 2 \wedge \mathrm{~b} 2) \vee(\mathrm{a} 3 \wedge \mathrm{~b} 3)$

## Sensitivity to Variable Ordering (2)

- Two different variable ordering lead to tow different ROBDD.
- Crucial importance in practice, determine the efficiency of ROBDD-based model checking.
- Finding the best variable ordering is NP-hard. It exists several heuristics to approach the problem.


## The ALGORITHM APPLY (1)

- If $B \phi$ and $B \psi$ are two OBDDs, the call apply(op, $B \phi$, $B \psi$ ) computes the OBBD of the formula $\phi$ op $\psi$.
-Operates recursively on the structure of the two OBDDs:
-We start at the root and follow parallel paths on the two OBDDs to the leaves;
-Once we arrive at the leaves, we apply the given boolean operation to the boolean constants 0 and 1 to form the result for that particular path.


## The ALGORITHM APPLY (2)



$f(a, b)=b$
with $a>b$

## The algorithm APPLY (2)


$f(a, b)=a \vee b$
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## The algorithm RESTRICT (1)

- If $B \phi$ is a OBDD, the call restrict( $0, \mathbf{x}, \mathbf{B} \phi$ ) (respectively restrict( $1, x, B \phi$ )) the OBDD for $\phi[0 / x]$ (respectively $\phi[1 / \mathrm{x}]$ ).
- restrict(0, $\mathbf{x}, \mathrm{B} \phi)$
-For each node $v$ labeled with $x$ :
$\Rightarrow$ Incoming edges are redirected to low(v);
$\rightarrow$ Node $v$ is removed.
- restrict(1, $x, B \phi)$
-As above but redirected to high(v).


## The ALgorithm RESTRICT (1)


$B \phi$

restrict( $0, a 3, B \phi)$

restrict(1, a3, B $\phi$ )

## References

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