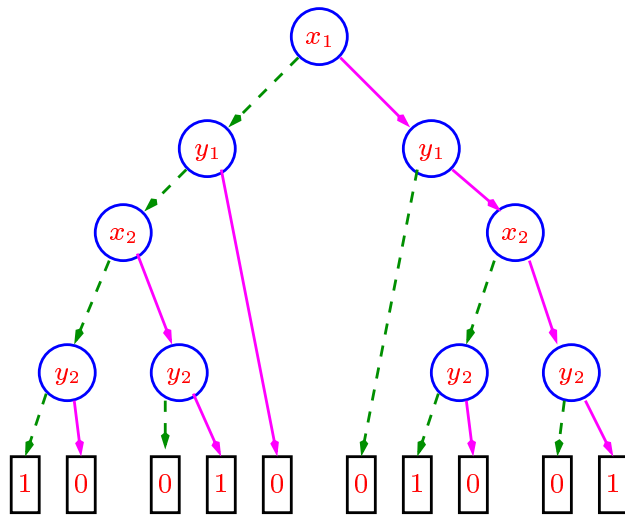


### BDD's

We start with a **binary decision diagram**. For example, following is a decision diagram (tree) for the formula  $(x_1 = y_1) \wedge (x_2 = y_2)$ :

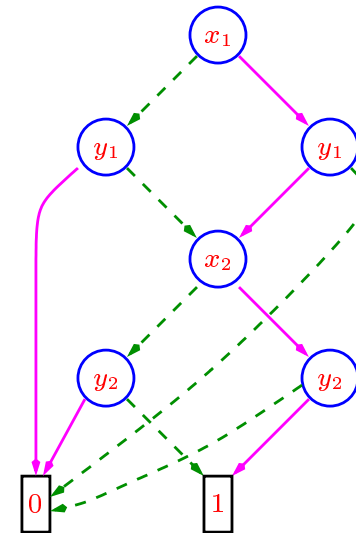


In general, it requires an **exponential** number of nodes.

### Optimize

- **Identify** identical subgraphs.
- **Remove redundant** tests.

Yielding:



## Definitions

A **binary decision diagram BDD** is a rooted, directed acyclic graph with

- One or two nodes of out-degree zero labeled **0** or **1**, and
- A set of variable nodes  $u$  of out-degree 2. The two outgoing edges are given by the functions  $low(u)$  and  $high(u)$ . A variable  $var(u)$  is associated with each node.

A **BDD** is **ordered (OBDD)** if the variables respect a given linear order  $x_1 < x_2 < \dots < x_n$  on all paths through the graph. An **OBDD** is **reduced (ROBDD)** if it satisfies:

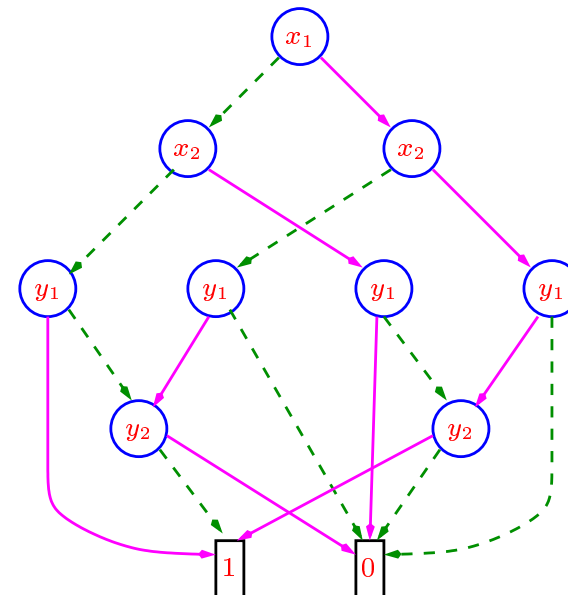
- **Uniqueness** – no two distinct nodes are the roots of isomorphic subgraphs.
- **No redundant tests** –  $low(u) \neq high(u)$  for all nodes  $u$  in the graph.

For simplicity, we will refer to ROBDD simply as **BDDs**.

## Canonicity

**Claim 4.** For every function  $f : \mathbf{Bool}^n \rightarrow \mathbf{Bool}$  and variable ordering  $x_1 < x_2 < \dots < x_n$ , there exists exactly one **BDD** representing this function.

The complexity of **BDD** representation is very sensitive to the **variable ordering**. For example, the **BDD** representation of  $(x_1 = y_1) \wedge (x_2 = y_2)$  under the variable ordering  $x_1 < x_2 < y_1 < y_2$  is:



## Implementation of BDD Packages

### Types and Variables:

$node = \text{naturals}$   
 $var\_num = \text{naturals}$   
 $node\_rec = \left[ \begin{array}{l} \text{record of} \\ \quad var \quad : \quad var\_num; \\ \quad low, high : \quad node \\ \text{end\_record} \end{array} \right]$   
 $T : node \rightarrow node\_rec$   
 $H : node\_rec \rightarrow node \cup \{\perp\}$

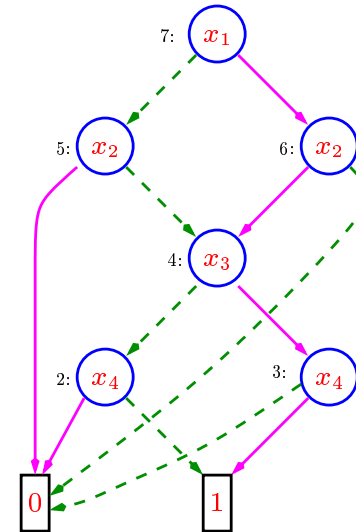
### Operations:

$init(T)$  Initialize  $T$  to contain only 0 and 1  
 $u := new(T, i, \ell, h)$  allocate a new node  $u$ , such that  
 $T(u) = \langle i, \ell, h \rangle$   
 $init(H)$  initialize  $H$  to  $\perp$

$H$  is the inverse of  $T$ . That is,  $H(T(u)) = u$ , for every  $u \in dom(T)$ .

We will write  $var(u)$ ,  $low(u)$ ,  $high(u)$ , and  $H(i, \ell, h)$  as abbreviations for  $T(u).var$ ,  $T(u).low$ ,  $T(u).high$ , and  $H(\langle i, \ell, h \rangle)$ .

## Internal Representation



$T : u \rightarrow \langle i, \ell, h \rangle$

$u$	$var$	$low$	$high$
0			
1			
2	4	1	0
3	4	0	1
4	3	2	3
5	2	4	0
6	2	0	4
7	1	5	6

## Making or Retrieving a `node_id`

**Function** `MK` ( $i : \text{var\_num}; \ell, h : \text{node}$ ) :  $\text{node}$

-- Make or retrieve a node with attributes  $(i, \ell, h)$

```

1:  if  $\ell = h$  then return  $\ell$ 
2:  if  $H(i, \ell, h) \neq \perp$  then return  $H(i, \ell, h)$ 
3:   $u := \text{new}(i, \ell, h)$ 
4:   $H(i, \ell, h) := u$ 
5:  return  $u$ 

```

## Applying a Binary Boolean Operation to two BDD's

Let  $op : \text{Bool} \times \text{Bool} \rightarrow \text{Bool}$  be a binary boolean operation. The following function uses the auxiliary dynamic array  $G : \text{node} \times \text{node} \rightarrow \text{node}$ .

**Function** `Apply` ( $op ; u_1, u_2 : \text{node}$ ) :  $\text{node}$

-- Apply  $op$  to BDD's  $u_1$  and  $u_2$

$G := \perp$

**function** `App` ( $u_1, u_2 : \text{node}$ ) :  $\text{node} =$

if  $G[u_1, u_2] \neq \perp$  then return  $G[u_1, u_2]$

if  $u_1 \in \{0, 1\} \wedge u_2 \in \{0, 1\}$  then  $u := op(u_1, u_2)$

else if  $var(u_1) = var(u_2)$  then

$u := \text{MK}(var(u_1), \text{App}(low(u_1), low(u_2)),$   
 $\text{App}(high(u_1), high(u_2)))$

else if  $var(u_1) < var(u_2)$  then

$u := \text{MK}(var(u_1), \text{App}(low(u_1), u_2), \text{App}(high(u_1), u_2))$

else  $(*var(u_1) > var(u_2)*)$

$u := \text{MK}(var(u_2), \text{App}(u_1, low(u_2)), \text{App}(u_1, high(u_2)))$

$G[u_1, u_2] := u$

return  $u$

**end** `App`

return `App`( $u_1, u_2$ )

## Restriction (Substitution)

```

Function REST (u : node; j : var_num; b : Bool) : node
    -- Substitute b for xj in BDD u
    G := ⊥
    function res(u : node) : node =
        if G[u] ≠ ⊥ then return G[u]
        if var(u) > j then r := u
        else if var(u) < j then
            r := MK(var(u), res(low(u)), res(high(u)))
        else (*var(u) = j*) if b = 0 then r := low(u)
            else r := high(u)
        G[u] := r
        return r
    end res
    return res(u)
  
```

Restriction is the same as substitution. We denote by  $t[x \mapsto b]$  the result of substituting  $b$  for  $x$  in assertion  $t$ .

## Quantification

Existential quantification can be computed, using the equivalence

$$\exists x : t \sim t[x \mapsto 0] \vee t[x \mapsto 1]$$

Universal quantification can be computed dually:

$$\forall x : t \sim t[x \mapsto 0] \wedge t[x \mapsto 1]$$

## Application to Symbolic Model Checking

Let  $V$  be the state variables for the FDS  $\mathcal{D}$ . Taking a vocabulary  $U = V \cup V'$ , we represent the state formulas  $\Theta$ ,  $J$  for each  $J \in \mathcal{J}$ ,  $p_i$ ,  $q_i$ , for each  $\langle p_i, q_i \rangle \in \mathcal{C}$ , and the SMC-INV symbolic working variables *new* and *old* as BDD's over  $U$  which are independent of  $V'$ .

The transition relation  $\rho$  is represented as a BDD over  $U$  which may be fully dependent on both  $V$  and  $V'$ .

All the boolean operations used in the SMC-INV algorithm can be implemented by the Apply function. Negation can be computed by  $\neg t = t \oplus 1$ , where  $\oplus$  is sum modulo 2.

To check for equivalence such as  $old = new$  we compute  $t := (old \leftrightarrow new)$  and then verify that the result is the singleton BDD 1.

The existential pre-condition *transformer* is computed by

$$\rho \diamond \psi = \exists V' : \rho(V, V') \wedge \psi(V')$$

Priming an assertion  $\psi$  is performed by

$$prime(\psi) = \exists V' : \psi(V) \wedge V' = V$$