

# CTL Model Checking

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# Background

- Example: verification of web applications → e.g. to prove existence of a path from page A to page B.

Use of **CTL** is popular → another variant of “temporal logic” → different way of model checking.

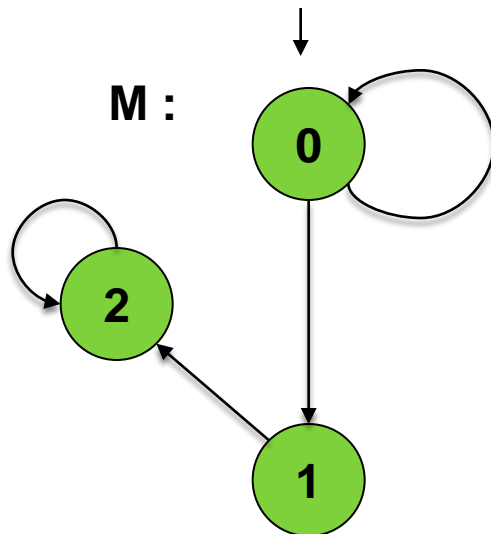
- Model checker for verifying CTL: **SMV**. Also uses a technique called “symbolic” model checking.
  - In contrast, SPIN model checking is called “explicit state”.
  - We’ll show you how this symbolic MC works, but first we’ll take a look at CTL, and the web application case study.

# Overview

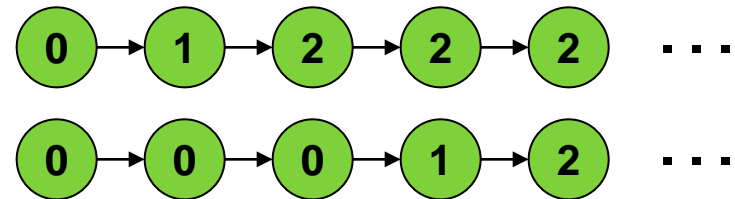
- CTL
  - CTL
  - Model checking
- Symbolic model checking
- BDD
  - Definition
  - Reducing BDD
  - Operations on BDD
- Acknowledgement: some slides are taken and adapted from various presentations by Randal Bryant (CMU), Marsha Chechik (Toronto)

# CTL

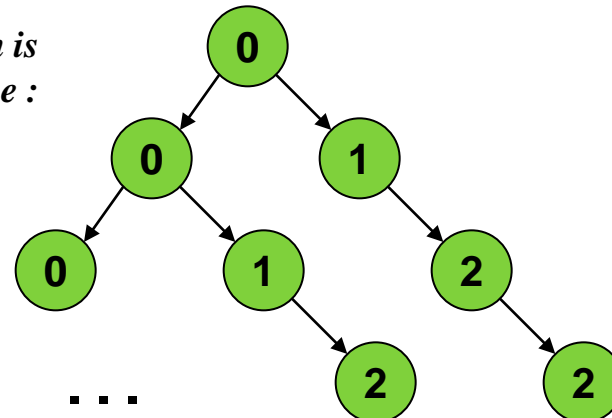
- Stands for *Computation Tree Logic*
- Consider this Kripke structure (labeling omitted) :



*In LTL, an “execution” is defined as a sequence :*



*In CTL an execution is viewed as a tree :*



# CTL

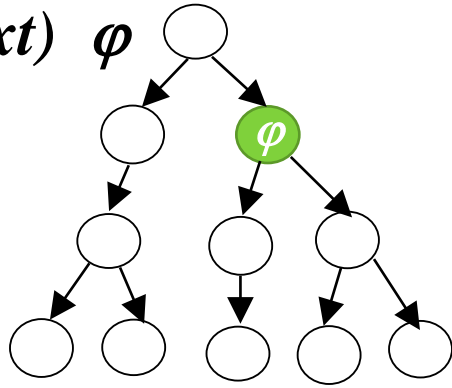
- Informally, CTL is interpreted over computation trees.

$M \models \varphi$  = M's computation trees satisfies  $\varphi$

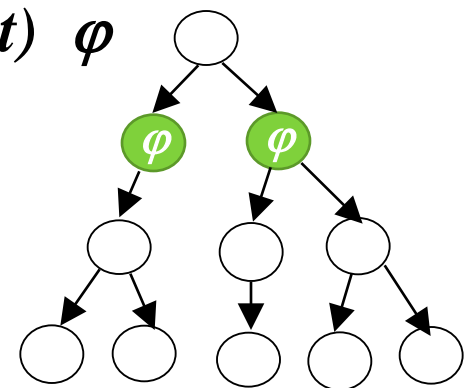
- We have path quantifiers :
  - A** ... : holds for all path (starting at the tree's root)
  - E** ... : holds for some path
- Temporal operators :
  - X** ... : holds next time
  - F** ... : holds in the future
  - G** ... : always hold
  - U** : until

# Intuition of CTL operators

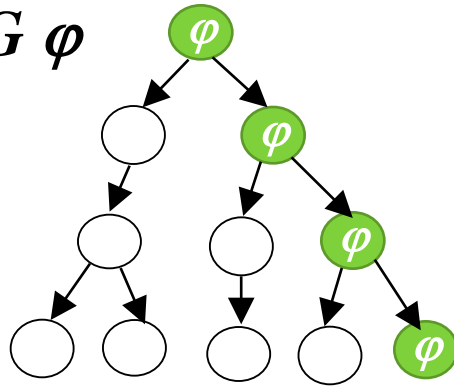
***EX (exists next)  $\varphi$***



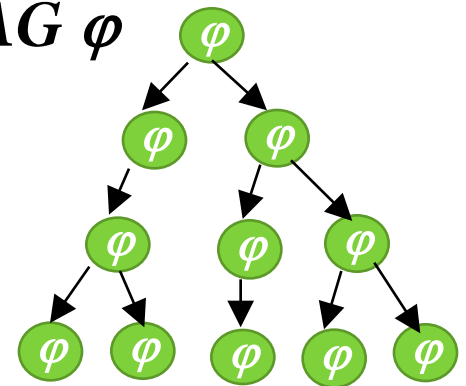
***AX (all next)  $\varphi$***



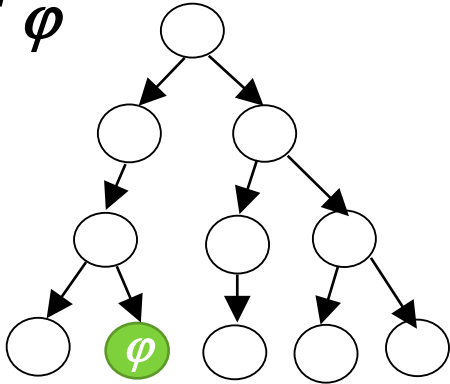
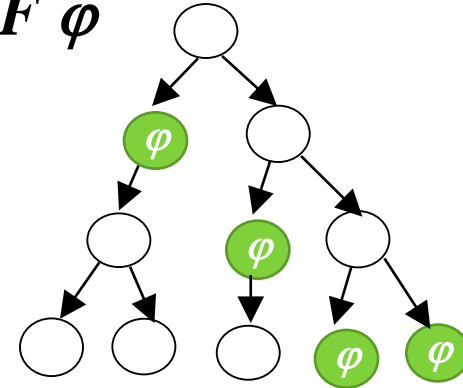
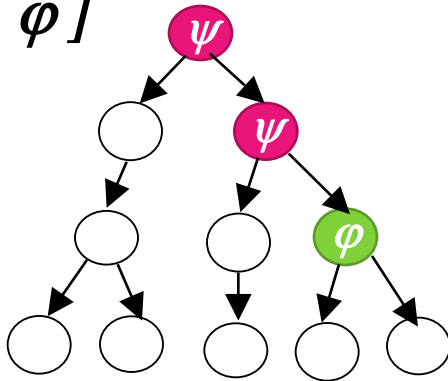
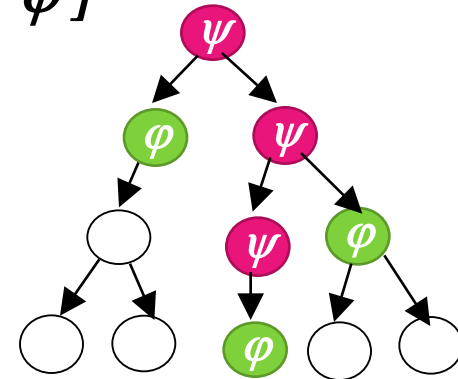
***EG  $\varphi$***



***AG  $\varphi$***



# Intuition of CTL operators

$$EF \varphi$$

$$AF \varphi$$

$$E[\psi U \varphi]$$

$$A[\psi U \varphi]$$


# Syntax

$\varphi ::= p$       // atomic (state) proposition

|  $\neg\varphi$  |  $\varphi_1 \wedge \varphi_2$

|  $EX \varphi$  |  $AX \varphi$

|  $E[\varphi_1 \cup \varphi_2]$  |  $A[\varphi_1 \cup \varphi_2]$



# Derived operators

- $\psi \vee \varphi = \neg(\neg\varphi \wedge \neg\psi)$
- $\psi \rightarrow \varphi = \neg\psi \vee \varphi$
- $EF \varphi = E[ \text{true} \cup \varphi ]$
- $AF \varphi = A[ \text{true} \cup \varphi ]$
- $EG \varphi = \neg AF \neg\varphi$
- $AG \varphi = \neg EF \neg\varphi$

# Semantics

$R : S \rightarrow \{S\}$  : transition relation  
 $V : S \rightarrow \{Prop\}$  : observations

- Let  $M = (S, s_0, R, V)$  be a Kripke structure ☺
- $M, t \models \varphi$        $\varphi$  holds on the comp. tree  $t$
- $M \models \varphi$       is defined as  $M, \mathbf{tree}(s_0) \models \varphi$
- $M, t \models p$       =     $p \in V(\mathbf{root}(t))$
- $M, t \models \neg\varphi$     =    not (  $M, t \models \varphi$  )
- $M, t \models \varphi \wedge \psi$     =     $M, t \models \varphi$     and     $M, t \models \psi$

# Semantic of “X”

- $M, t \models EX\varphi = ( \exists v \in R(\text{root}(t)) :: M, \text{tree}(v) \models \varphi )$
- $M, t \models AX\varphi = ( \forall v \in R(\text{root}(t)) :: M, \text{tree}(v) \models \varphi )$

This definition of the A-quantifier is a bit problematic if you have a terminal state  $t$  (state with no successor), because then you get  $t \models AX\varphi$  for free, for any  $\varphi$  (the above  $\forall$ -quantification would quantify over an empty domain). This can be patched; but we'll just assume that your  $M$  contains no terminal state (all executions are infinite).

# Semantic of “U”

- $M, t \models E[\psi \text{ U } \varphi] =$

There is a path  $\sigma$  in  $M$ , starting in **root**( $t$ ) such that:

- For some  $i \geq 0$ ,  $M, \text{tree}(\sigma_i) \models \varphi$
- For all previous  $j$ ,  $0 \leq j < i$ ,  $M, \text{tree}(\sigma_j) \models \psi$

- $M, s \models A[\psi \text{ U } \varphi] =$

For all path  $\sigma$  in  $M$ , starting in **root**( $t$ ), these hold:

# LTL vs CTL

- They are not the same.
- Some properties can be expressed in both:

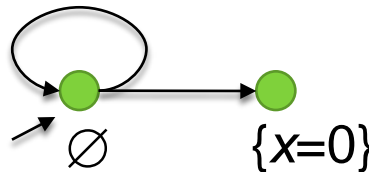
$$\mathbf{AG} (x=0) \quad = \quad \mathbf{[]} (x=0)$$

$$\mathbf{AF} (x=0) \quad = \quad \mathbf{<>}(x=0)$$

$$\mathbf{A}[x=0 \text{ U } y=0] \quad = \quad x=0 \text{ U } y=0$$

- Some CTL properties can't be expressed in LTL, e.g:

$$\mathbf{EF} (x = 0)$$

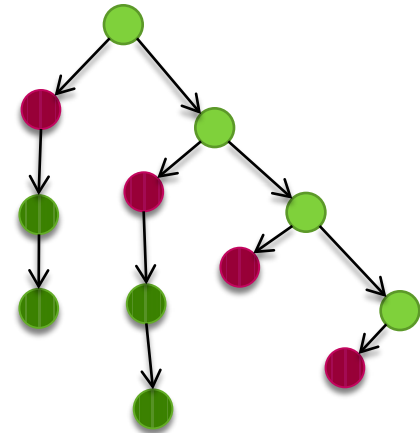
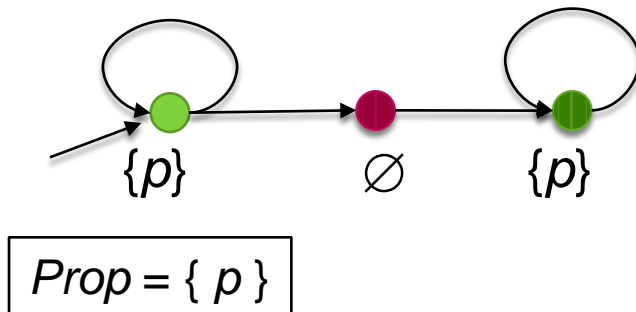


$$Prop = \{ x = 0 \}$$

# LTL vs CTL

- Some LTL properties cannot be expressed in CTL, e.g.

$\langle \rangle \Box p$



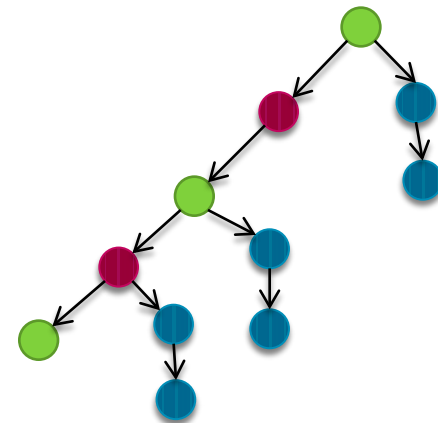
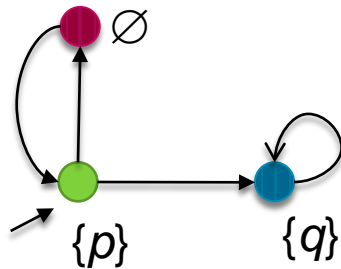
E.g.  $AF\ AG\ p$  does not express the property; the above Kripke does not satisfy it.

# LTL vs CTL

- Another example, fairness restriction:

$$(\Box \langle \rangle p \rightarrow \langle \rangle q) \rightarrow \langle \rangle q$$

$$= \Box \langle \rangle p \vee \langle \rangle q$$



e.g.  $\text{AGAF } p \vee \text{AF } q$  does not hold on the tree.

# CTL\*

- Allows more combinations of path and temporal quantifiers.
- A CTL\* formula is a “state formula”, syntax:

(State formula)

$$\begin{array}{l} \varphi :: p \\ \quad | \neg\varphi \quad | \varphi_1 \vee \varphi_2 \\ \quad | \mathbf{E} f \quad | \mathbf{A} f \end{array} \quad \begin{array}{l} // p \text{ is atomic proposition} \\ // f \text{ is a path formula} \end{array}$$

(Path formula)

$$\begin{array}{l} f :: \varphi \\ \quad | \neg f \quad | f \vee g \quad | \mathbf{X} f \quad | \mathbf{F} f \quad | \mathbf{G} f \quad | f_1 \mathbf{U} f_2 \end{array}$$

We can express all CTL formulas in CTL\*, but e.g. this is also possible in CTL\* :

**AFG** ( $x=0$ )



# Example: web application

- Based on:

*A Model Checking-based Method for Verifying Web Application Design*, Donini et al, in Int. Workshop on Web Lang. and Formal Methods (WLFM), 2005.

- In their approach, models are obtained from UML design of the web application.
- Other possibilities:
  - By crawling a web site
  - By analyzing log

# WAG

- Model web application as a graph  $(N, C)$ , where

$$N = W \cup P \cup L \cup A$$

each component is disjoint.

W	set of windows
P	set of pages
L	set of links
A	set of actions

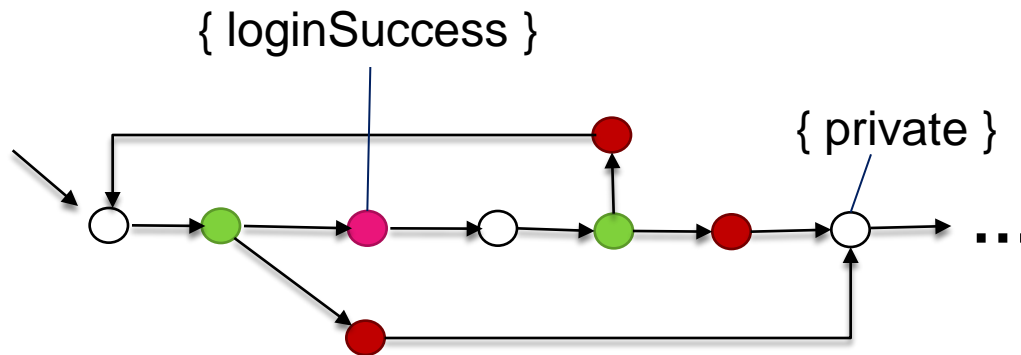
$C : N \rightarrow 2^N$  defines the arrows in the graph, and such that:

- A window can only be connected to pages
- A page can only be connected to links or actions
- A link or an action can only be connected to windows

# WAG as Kripke

- See a WAG as a Kripke structure, e.g. each node in the WAG is a state in the Kripke structure.
- Label each state with propositions w,p,l,a to express whether it is a window, or a page etc.
- Introduce other propositions of interest, e.g.
  - login, logout To mark a login/logout action
  - private To mark states considered “private”
  - error To mark “error page”.
- Label the states with these propositions.

# Example



- *frame/window*
- *page*
- *action*
- *link*

Now properties like these are well defined...

- **A** ( $\neg$ private **W**  $\neg$ private  $\wedge$  loginSuccess)

*You cannot get to the private part without logging in....*

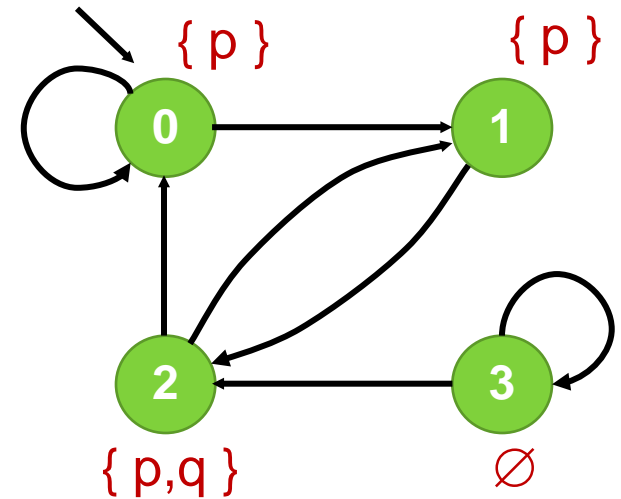
- **AG** ( loginSuccess  $\rightarrow$  **EF** private )

*Once logged in, it should be possible to get to the private part*

-

# Model checking CTL formulas

- Kripke  $M = (S, s_0, R, V)$
- We want to verify  $M \models \varphi$
- Assume  $\varphi$  is expressed in CTL's (chosen) basic operators.
- The verification algorithm works by systematically labeling  $M$ 's states with subformulas of  $\varphi$ .



*Whenever we conclude  $root(s) \models f$ , we label  $s$  with  $f$ .*

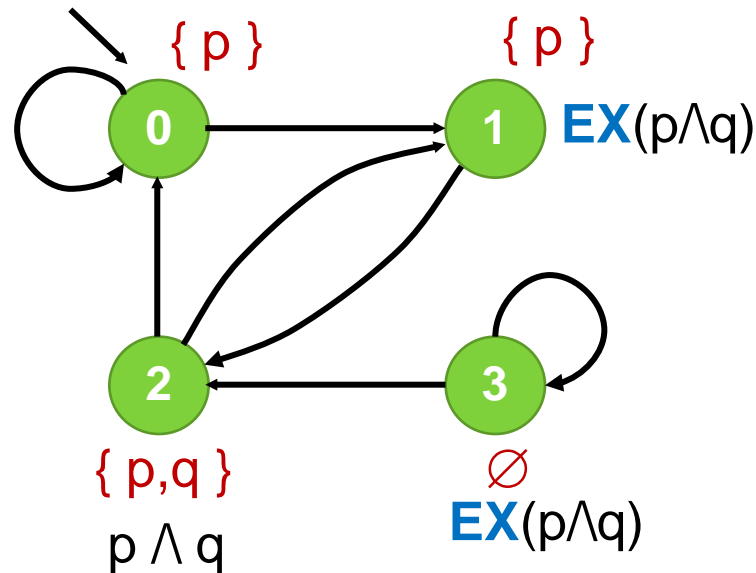
- After the labeling:

$M \models \varphi$  iff  $s_0$  is labeled with  $\varphi$

# Example, checking **EX**( $p \wedge q$ )

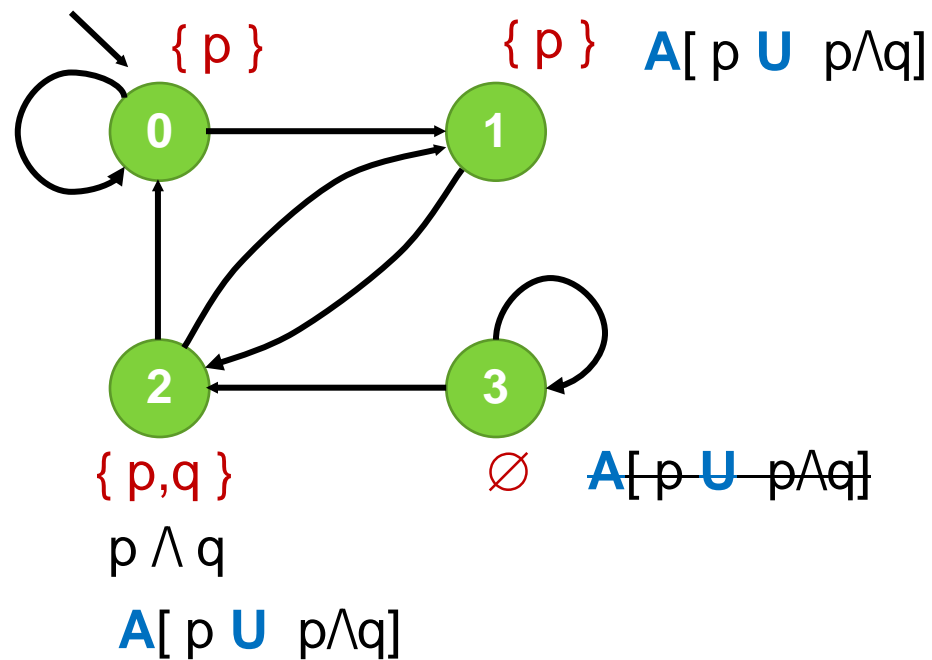
$Prop = \{p, q\}$

*Initial state is not labeled with the target formula; so the formula is not valid.*



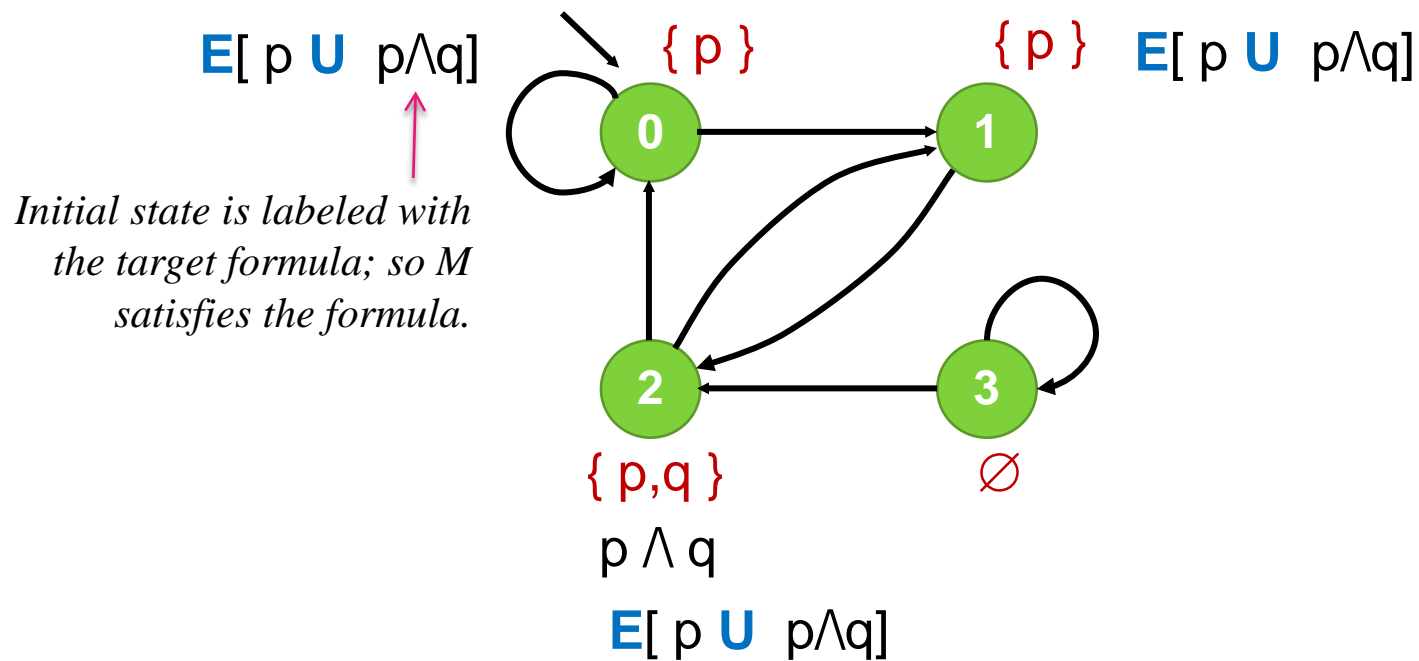
# Example, checking $A[ p \text{ U } (p \wedge q) ]$

*At the end, initial state is not labeled with the target formula; so the formula is not valid*





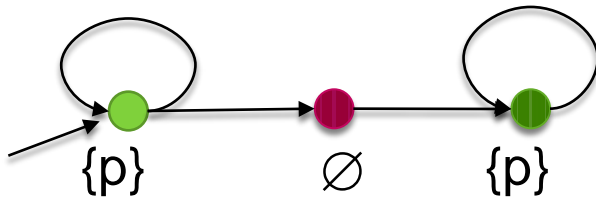
# Example, checking: $E[ p \text{ U } (p \wedge q) ]$



# Can we apply this to LTL ?

- Consider  $\langle \rangle p = \langle \rangle \neg \langle \rangle \neg p$
- Applying labeling :

$$Prop = \{ p \}$$

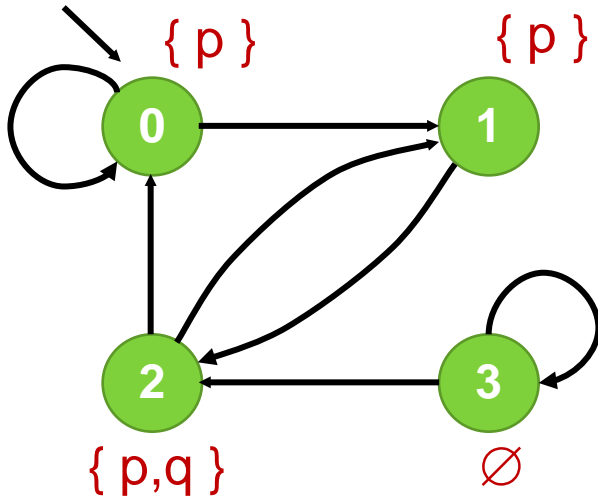

$$\neg \langle \rangle \neg p \quad \dots ??$$
$$\langle \rangle \neg p$$
 $\neg \langle \rangle \neg p \quad \dots \text{ok}$ 

When you cant label a state with  $\varphi$ , for LTL this does not imply that  $\neg\varphi$  is valid on all executions starting from that state. It worked in CTL because  $\neg AF\neg p = EG p$  ... where as what we want is  $\Box p$ , which corresponds to  $AG p$ .

# Symbolic representation

- You need the full statespace to do the labeling!
- Idea:
  - Use formulas to encode sets of states (e.g. to express the set of states labeled by something)
  - A small formula can express a large set of states → suggest a potential of space reduction.

# Example



4 states, can be encoded by 2 boolean variables  $x$  and  $y$ .

St-0	$\neg x \neg y$
St-1	$\neg xy$
St-2	$x \neg y$
St-3	$xy$

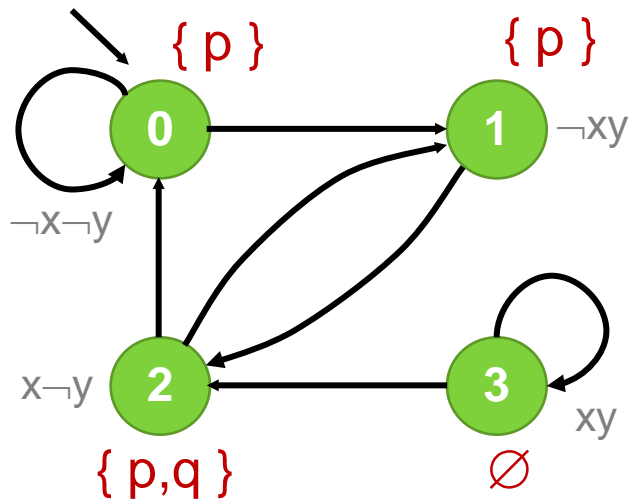
E.g. the set of states where  $q$  holds is encoded by the formula:

$$x \neg y$$

Similarly, the set of states where  $p$  holds :  $\{0,1,2\}$ , can be encoded by formula:

$$\neg(xy)$$

# Example



States encoding:

St-0	$\neg x \neg y$
St-1	$\neg xy$
St-2	$x \neg y$
St-3	$xy$

We can also describe this more program-like:

```

if state ∈ {0,2} → goto {0,1}
[] state ∈ {1,3} → goto 2
[] state = 3     → goto {2,3}
fi
    
```

N.D.

which can be encoded with this boolean formula:

$$\neg y \neg x' \vee yx' \neg y' \vee xyx'$$

# Example

```
byte x ; // unspecified initial value
```

```
if x≠255 → x=0 ;
```

The automaton has 256 states,  
with 256 arrows.

- Bit matrix : 8.3 Kbyte
- List of arrows: 512 bytes

With boolean formula:

$$\neg(x_0 \dots x_7) \wedge \neg x'_0 \dots \neg x'_7 \\ \vee \\ x_0 \dots x_7 \wedge x'_0 \dots x'_7$$

# Model checking

- When we label states with a formula  $f$ , we are basically calculating the set of states (of  $M$ ) that satisfy  $f$ .
- Introduce this notation:

$$W_f = \text{the set of states (whose comp. trees) satisfy } f$$
$$= \{ s \mid s \in S, M, \text{tree}(s) \models f \}$$

- We now encode  $W_f$  as a boolean formula

$$M \models f \quad \text{if and only if} \quad W_f \text{ evaluated on } s_0 \text{ returns true}$$

# Labeling

- If  $p$  is an atomic formula:

$W_p$  = boolean formula representing the set of states where  $p$  holds.

- For conjunction:

$$W_{f \wedge g} = W_f \wedge W_g$$

- Negation:

$$W_{\neg f} = \neg W_f$$

- For EX:

$$W_{\text{EX}f} = \exists x', y' :: R \wedge W_f[x', y'/x, y]$$

- $AX f = \neg EX \neg f$



# On filtering arrows...

States encoding:

St-0	$\neg x \neg y$
St-1	$\neg x y$
St-2	$x \neg y$
St-3	$x y$

Suppose we have these arrows,  $R = \{1,3\} \rightarrow \{2\}$

$\{3\} \rightarrow \{1,3\}$

$$y \ x' \neg y' \ \vee \ x y y'$$

To filter arrows over destinations, conjunct it with a formula  $f$  over primed vars, e.g to get arrows that end up in state 1 :

$$(y \ x' \neg y' \ \vee \ x y y') \ \wedge \ \neg x' y'$$

To get only the source-states, quantify over primed vars, e.g. :

$$\exists x', y' :: (y \ x' \neg y' \ \vee \ x y y') \ \wedge \ \neg x' y'$$

# Filtering 2

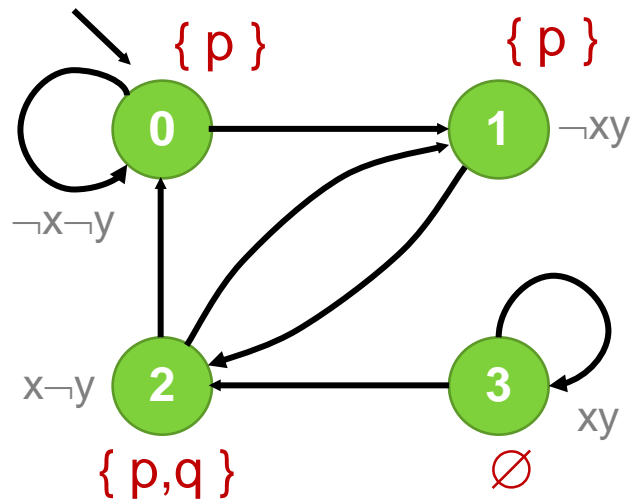
$$(\forall x', y' :: R(x, y, x', y') \Rightarrow W(x', y'))$$

Would give the set of source-states whose outgoing arrows all go to  $W$ .

Note:

- this would include all terminal states in  $M$  ... weird, but we discussed this before. We assumed  $M$  does not contain terminals.
- this would include all invalid encodings (those states that were not actually in your  $M$ ) as well  $\rightarrow$  add a constraint that filters your result to drop those states.

# Example, **EX**<sub>p</sub>



States encoding:

St-0	$\neg x \neg y$
St-1	$\neg xy$
St-2	$x \neg y$
St-3	$xy$

$$W_p = \neg(xy)$$

$$W_{EXp} = \exists x', y' :: R \wedge \neg(x'y')$$

$$= \exists x', y' :: ((\neg y \neg x' \vee yx' \neg y' \vee xyx') \wedge \neg(x'y'))$$

$$= \text{true}$$

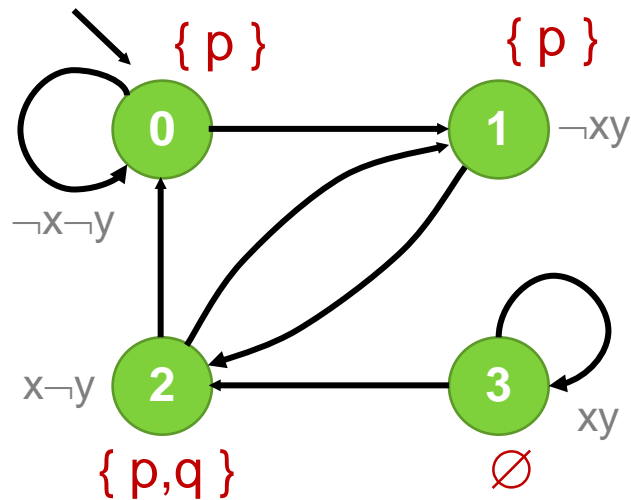
# Labeling

- E.g. the states satisfying  $E[f \text{ U } g]$  can be computed by:
  - Let  $K_0 = W_g$
  - Iteratively compute  $K_i$

$$K_{i+1} = K_i \vee ( \exists x', y' :: R \wedge W_f \wedge K_i[x', y'/x, y] )$$

- Stop when  $K_{i+1} = K_i$  ; then  $W_{E[p \text{ U } q]} = K_i$

# Example, $EX[ p \ U \ q ]$



States encoding:

St-0	$\neg x \neg y$
St-1	$\neg xy$
St-2	$x \neg y$
St-3	$xy$

$$K_0 = W_{\mathbf{q}} = x \neg y$$

$$K_1 = K_0 \vee (\exists x', y' :: R \wedge W_{\mathbf{p}} \wedge K_0[x', y'/x, y])$$

$$x \neg y \vee (\exists x', y' :: \dots \wedge \neg(xy) \wedge x' \neg y')$$

$$\bullet K_2 = \dots$$

Till fix point.

# But how to check fix point?

- To make this works, we need a way to efficiently check the equivalence of two boolean formulas:

$$f \leftrightarrow g$$

So, we can decide when to we have reached a fix-point

- In general this is an NP-hard problem.
- Use a SAT-solver to check if  $\neg(f \leftrightarrow g)$  is unsatisfiable.
- We'll discuss BDD approach

# Canonical representation

- = simplest/standard form.
- Here, a canonical representation  $C_f$  of a formula  $f$  is a representation such that:

$$f \leftrightarrow g \quad \text{iff} \quad C_f = C_g$$

- Gives us a way to check equivalence.
- Only useful if the cost of constructing  $C_f$ ,  $C_g$  + checking  $C_f = C_g$  is cheaper than directly checking  $f \leftrightarrow g$ .
- Some possibilities:
  - Truth table  $\rightarrow$  exponentially large.
  - DNF/CNF  $\rightarrow$  can also be exponentially large.

# BDD

- *Binary Decision Diagram*; a compact, and canonical representation of a boolean formula.
- Can be constructed and combined efficiently.
- Invented by Bryant:

"Graph-Based Algorithms for Boolean Function Manipulation". Bryant, in IEEE Transactions on Computers, C-35(8), 1986.



# Decision Tree

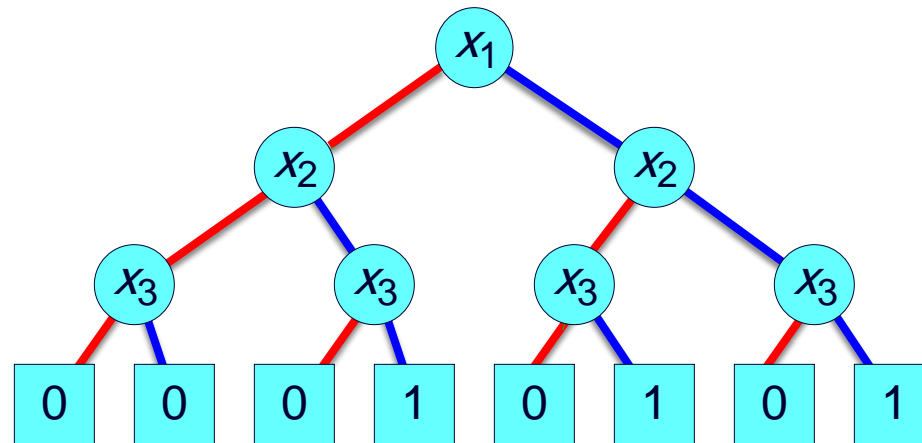
$$\neg x_1 x_2 x_3 \vee x_1 \neg x_2 x_3 \vee x_1 x_2 x_3$$

with truth table :

$x_1$	$x_2$	$x_3$	$f$
0	0	0	0
0	0	1	0
0	1	0	0
0	1	1	1
1	0	0	0
1	0	1	1
1	1	0	0
1	1	1	1

*TT is canonical if we fix the order of the columns.*

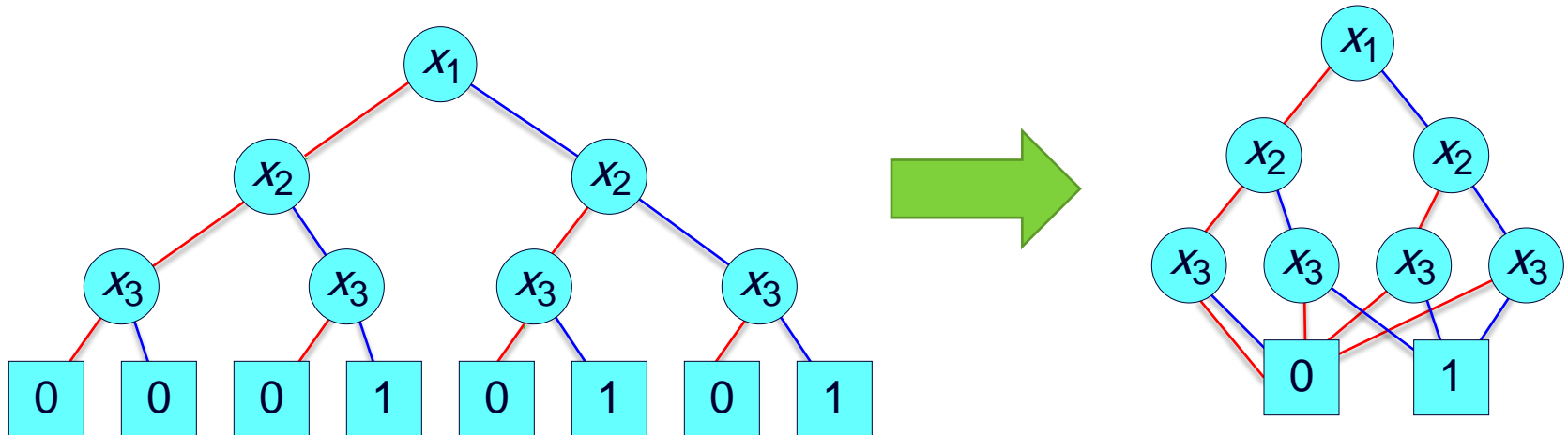
Or representing the table with a (binary decision) tree :



- Each node  $x_i$  represents a decision:
  - **Blue** out-edge from  $x_i \rightarrow$  assigning 1 to  $x_i$
  - **Red** out-edge from  $x_i \rightarrow$  assigning 0 to  $x_i$
- Function value is determined by leaf value.

# But we can compact the tree...

E.g. by merging the duplicate leaves:



*We can compact this further by merging duplicate subgraphs ...*

# Results

Word Size	Gates	Patterns	CPU Minutes	$A=B$ Graph
4	52	$1.6 \times 10^4$	1.1	197
8	123	$4.2 \times 10^6$	2.3	377
16	227	$2.7 \times 10^{11}$	6.3	737
32	473	$1.2 \times 10^{21}$	22.8	1457
64	927	$2.2 \times 10^{40}$	95.8	2897

Table 2. ALU Verification Examples

*Note: this is from Bryant's paper in 1986. They use their version of MC at that time, running it on an DEC VAX 11/780, with about 1 MIP speed ☺*

# Boolean formula

- A boolean formula (proposition logic formula) e.g.  $x \cdot y \vee z$  can be seen as a function :

$$f(x,y,z) = x \cdot y \vee z$$

- In Bryant's paper this is called a : boolean function.
- E.g. 'composing' functions as in

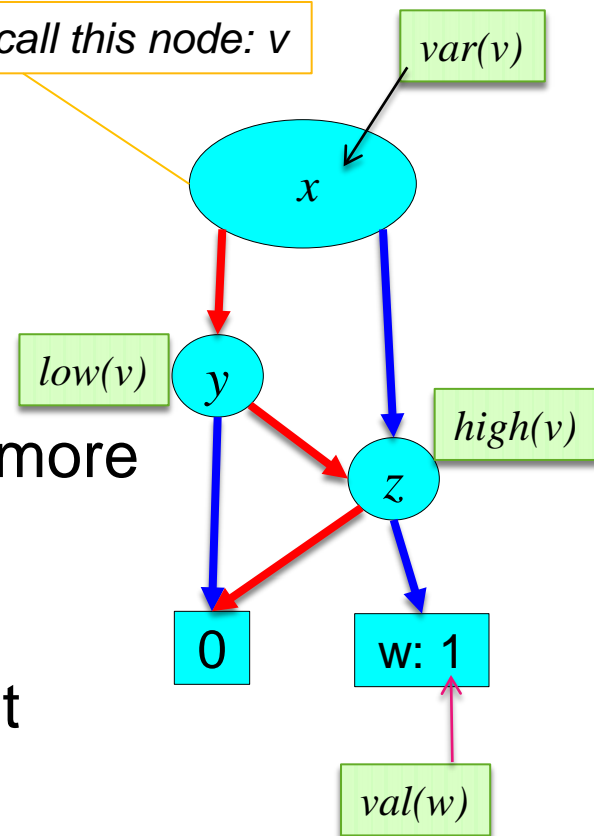
$$“f(x, y, g(x,y,z))”$$

is the same as the corresponding substitution.

# Binary Decision Diagram

- A BDD is a directed acyclic graph, with
  - a single root
  - two 'leaves'  $\rightarrow$  0/1
  - non-leaf node
    - labeled with 'varname'
    - has 2 children
- Along every path, no var appears more than 1x
- We'll keep the arrow-heads implicit
  - always from top to bottom

suppose we call this node:  $v$

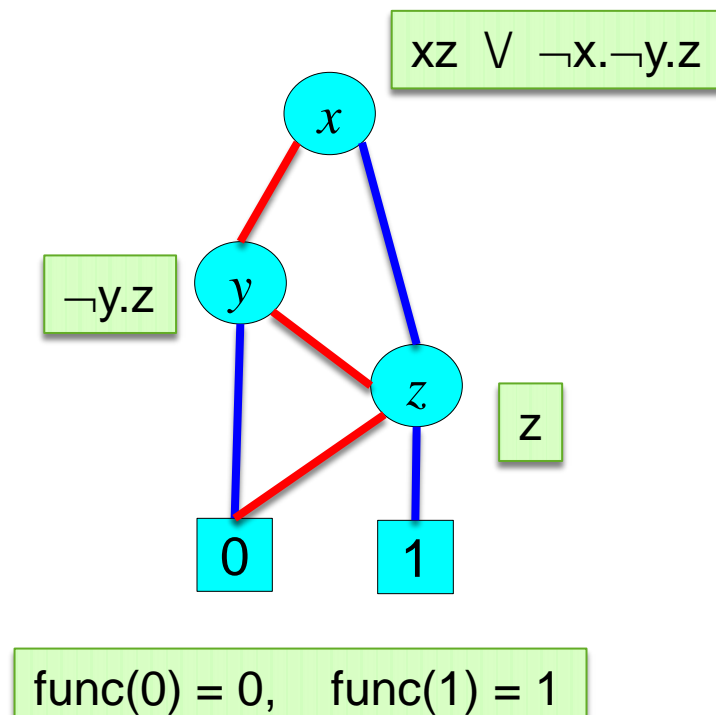


# func(G)

$x = \text{val}(v)$

- $\text{func}(v) = \neg x . \text{func}(\text{low}(v)) \vee x . \text{f}(\text{high}(v))$

$\text{func}(G) = \text{func}(\text{root})$



# Reduced BDD

- Two BDDs  $F$  and  $G$  are *isomorphic* if you can obtain  $G$  from  $F$  by renaming  $F$ 's nodes, vice versa.

But you are not allowed to rename  $\text{var}(v)$  nor  $\text{val}(v)$  !

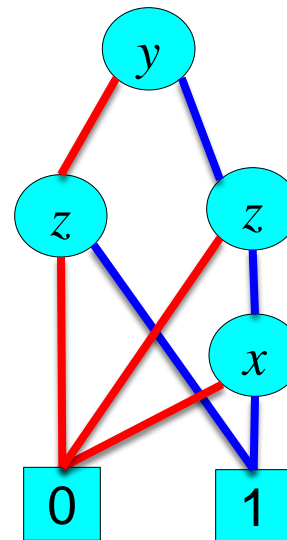
then:  $\text{func}(F) = \text{func}(G)$

- A BDD  $G$  is *reduced* if:
  - for any non-leaf node  $v$ ,  $\text{low}(v) \neq \text{high}(v)$ .
  - for any distinct nodes  $u$  and  $v$ , the sub-BDDs rooted at them are not isomorphic.

otherwise  $G$  can be reduced!

# Ordered BDD

- OBDD  $\rightarrow$  fix an ordering on the variables
  - let  $\text{index}(v) \rightarrow$  the order of  $v$  in this ordering ☺
  - $\text{index}(v) < \text{index}(\text{low}(v))$
  - *same with  $\text{high}(v)$*



*satisfies ordering  
[y,z,x] but not [x,y,z]*



# Reduced OBDD

- Reduced OBDD is canonical:

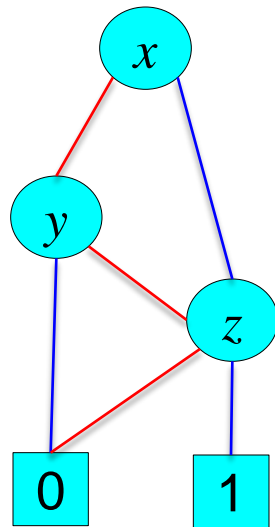
*If we fix the variable ordering, every boolean function is uniquely represented by a reduced OBDD (up to isomorphism).*

- Same idea as in truth tables: canonical if you fix the order of the columns.
- However, the chosen ordering may influence the size of the OBDD.

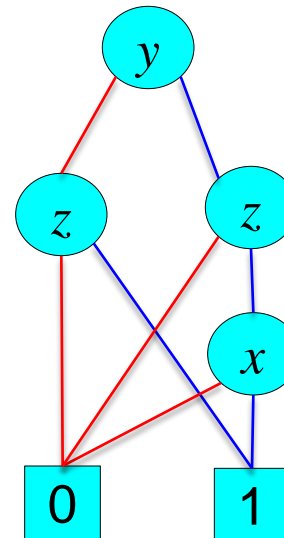
# Effect of ordering

Consider:

$$xyz \vee \neg yz$$



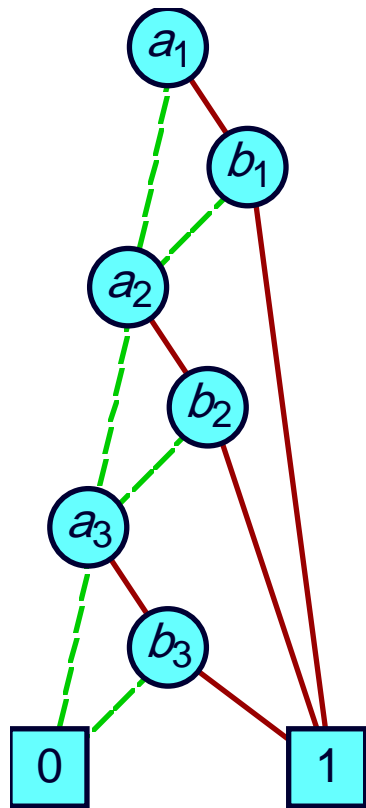
Order: x,y,z



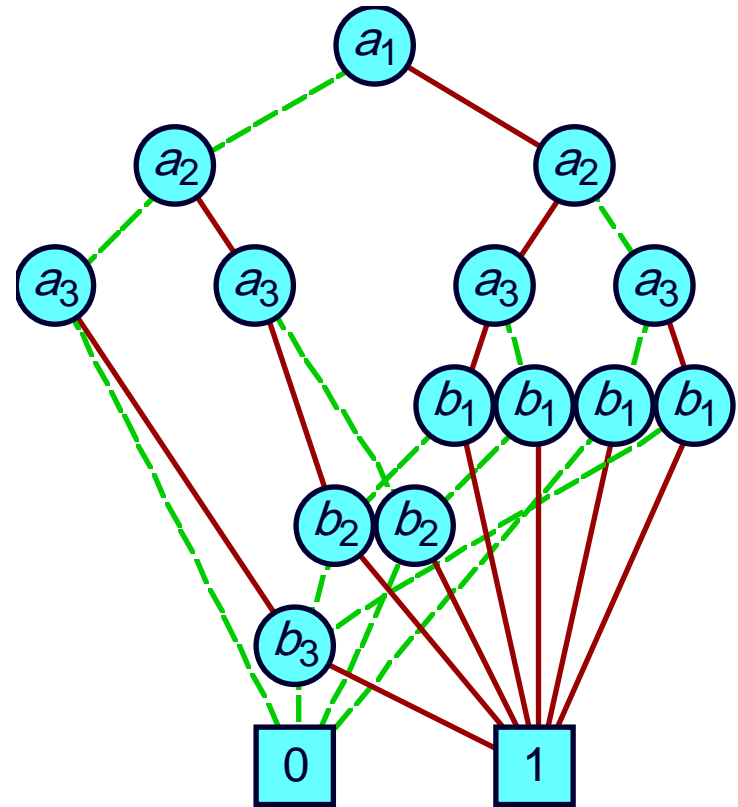
Order: y,z,x

# The difference can be huge...

consider:  $a_1b_1 \vee a_2b_2 \vee a_3b_3$



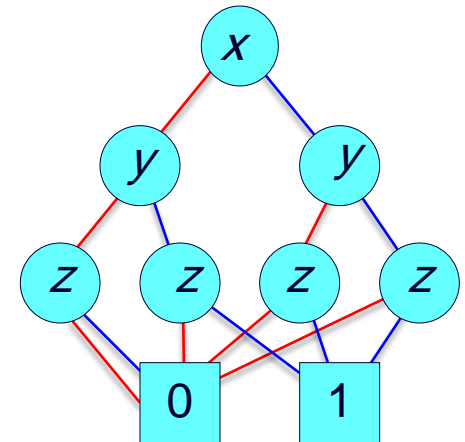
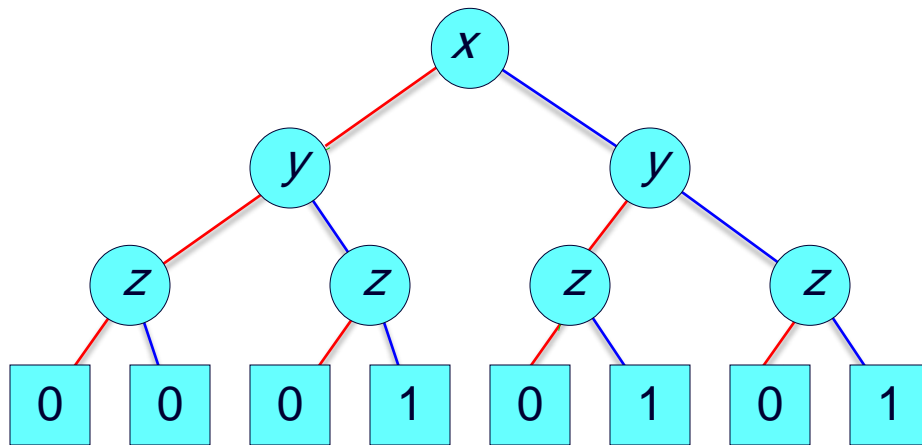
**Linear Growth**



**Exponential Growth**

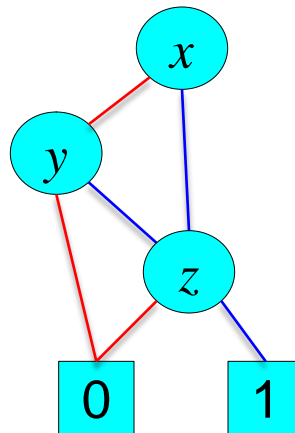
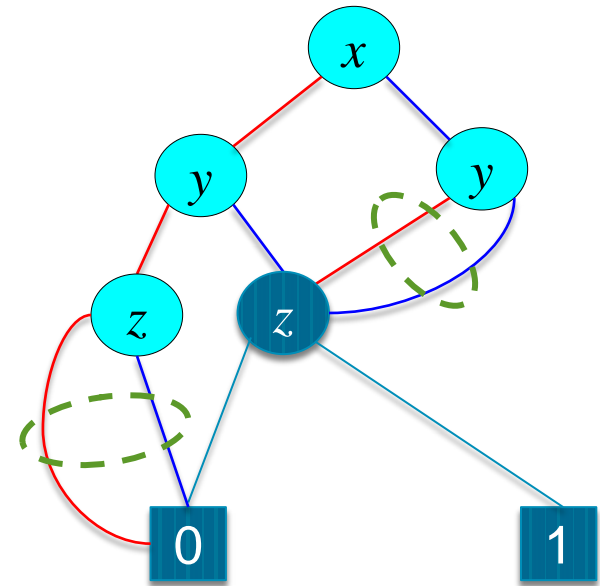
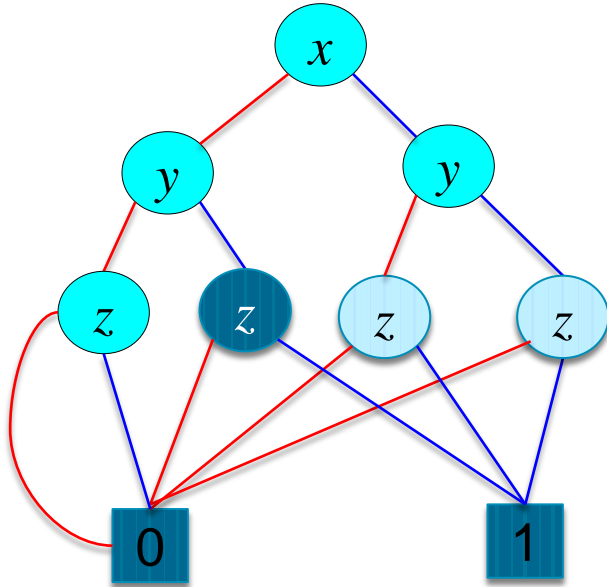
Here: “red” for value 1, “green” for 0.

# Reducing BDD



*By sharing leaves...*

# Reducing BDD



# The reduction algorithm

- Introduce **id**, function  $\text{Node} \rightarrow \text{Node}$

Use it to keep track which nodes actually represent the same formula.

Iterate/recurse and maintain this invariant:

$$\text{func}(u) = \text{func}(\text{id}(u))$$

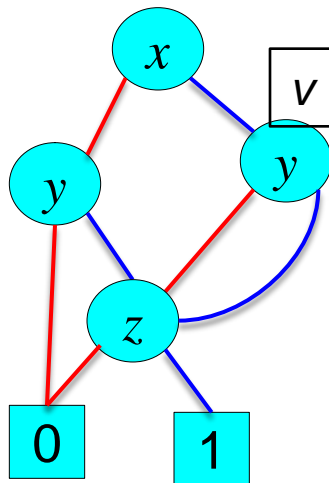
- So, we can remove  $u$  from the graph, and re-route arrows to it, to go to  $\text{id}(u)$  instead.
- Work bottom up, and such that a node decorated with  $x$  is processed after all nodes whose decorations come later in the var-ordering are processed first.

# The reduction algorithm

- We'll do the relabeling recursively, bottom-up.

Now suppose we have done the id re-labeling for all non-leaves  $w$  with  $\text{index}(w) > i$ . Suppose  $\text{index}(v) = i$

- **Case-1**,  $\text{id}(\text{low}(v)) = \text{id}(\text{high}(v))$  ; suppose  $\text{var}(v) = "x"$



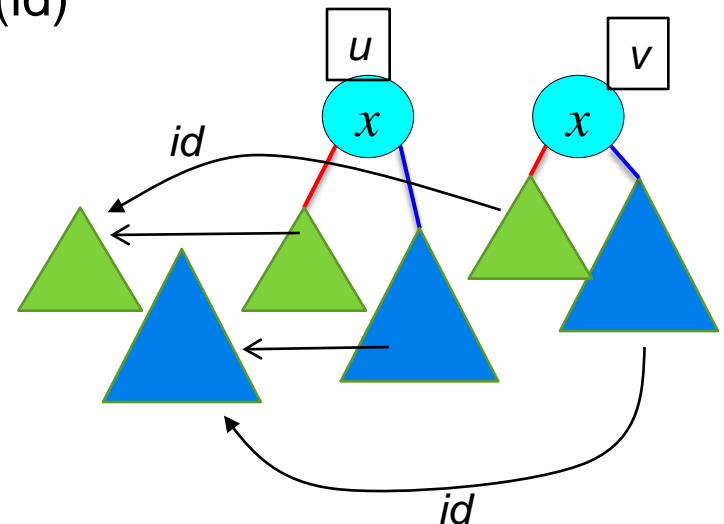
$$\begin{aligned} \text{func}(v) &= \neg y . \text{func}(\text{low}(v)) \vee y . \text{func}(\text{high}(v)) \\ &= \neg y . \text{func}(\text{id}(\text{low}(v))) \vee y . \text{func}(\text{id}(\text{high}(v))) \\ &= \text{func}(\text{id}(\text{low}(v))) \end{aligned}$$

So, update:  $\text{id}(v) := \text{id}(\text{low}(v))$

# The reduction algorithm

- **Case-2:** there is another non-leaf  $u \in \text{dom}(\text{id})$  ( $u$  has been processed) such that:

1.  $\text{var}(u) = \text{var}(v)$  ; suppose this is “ $x$ ”
2.  $\text{id}(\text{low}(u)) = \text{id}(\text{low}(v))$
3.  $\text{id}(\text{high}(u)) = \text{id}(\text{high}(v))$



$$\begin{aligned} \text{func}(v) &= \neg x \text{ func}(\text{low}(v)) \vee x \text{ func}(\text{high}(v)) \\ &= \neg x \text{ func}(\text{low}(u)) \vee x \text{ func}(\text{high}(u)) \quad // \text{ by inv} \\ &= \text{func}(u) \\ &= \text{func}(\text{id}(u)) \end{aligned}$$

So, update:  $\text{id}(v) := \text{id}(u)$



# Building a BDD

- So far: we can reduce a BDD.
- Recall in CTL model checking, e.g. to the set of states satisfying **EX** p is calculated by constructing this formula:

$$\boxed{\exists x', y' :: R \wedge W_p [x', y' / x, y]}$$

Since formulas are now represented as BDDs, this implies the need to combine BDDs.

- The combinators should be efficient!

# Basic operations to combine BDDs

- *Apply*  $f_1 <op> f_2$
- *Restrict*  $f \mid_{x=b}$  *// b is constant*
- *Compose*  $f_1 \mid_{x=f_2}$  *// f2 is another function*
- *Satisfy-one*

*Return a single combination of the variables of f that would make it true, else return nothing.*

# Quantification

- With restriction we can encode boolean quantifications :

$$(\exists y :: f(x,y)) = f(x,y) \mid_{y=0} \vee f(x,y) \mid_{y=1}$$

$$(\forall y :: f(x,y)) = \neg (\exists y :: \neg f(x,y))$$

(Recall that we need this in the MC algorithm).

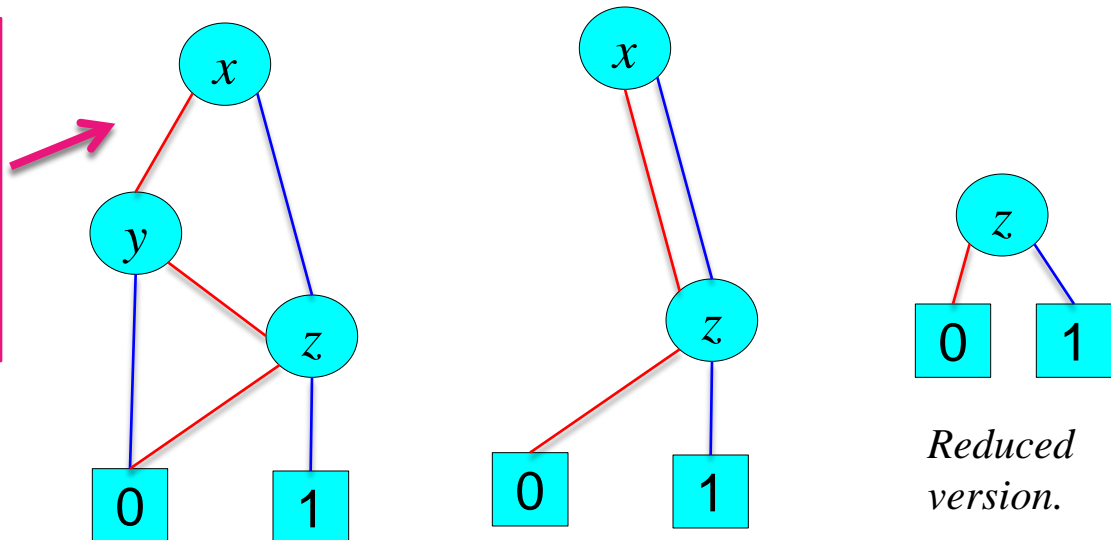
# Restriction

- $f(x,y,z) \mid_{y=c}$  how to construct the BDD of the new function??  
 $f(x,y,z) \mid_{y=0} \rightarrow$  replace all  $y$  nodes by low-sub-tree  
 $f(x,y,z) \mid_{y=1} \rightarrow$  replace all  $y$  nodes by high-sub-tree

Example:

$$f(x,y,z) = xz \vee \neg x \neg yz$$

$$\text{So, } f(x,y,z) \mid_{y=0} = z$$



# Apply

- “Apply”, denoted by  $f \text{ <op> } g$ , means the boolean function obtained by applying op to f and g.

E.g. assuming they take x,y as parameters,  $f \text{ <and> } g$  means the function that maps x,y to  $f(x,y) \wedge g(x,y)$ .

- A single algorithm to implement  $\wedge$ ,  $\vee$ , xor
- We can even implement  $\neg f$ , namely as  $f \text{ <xor> } 1$

# Apply

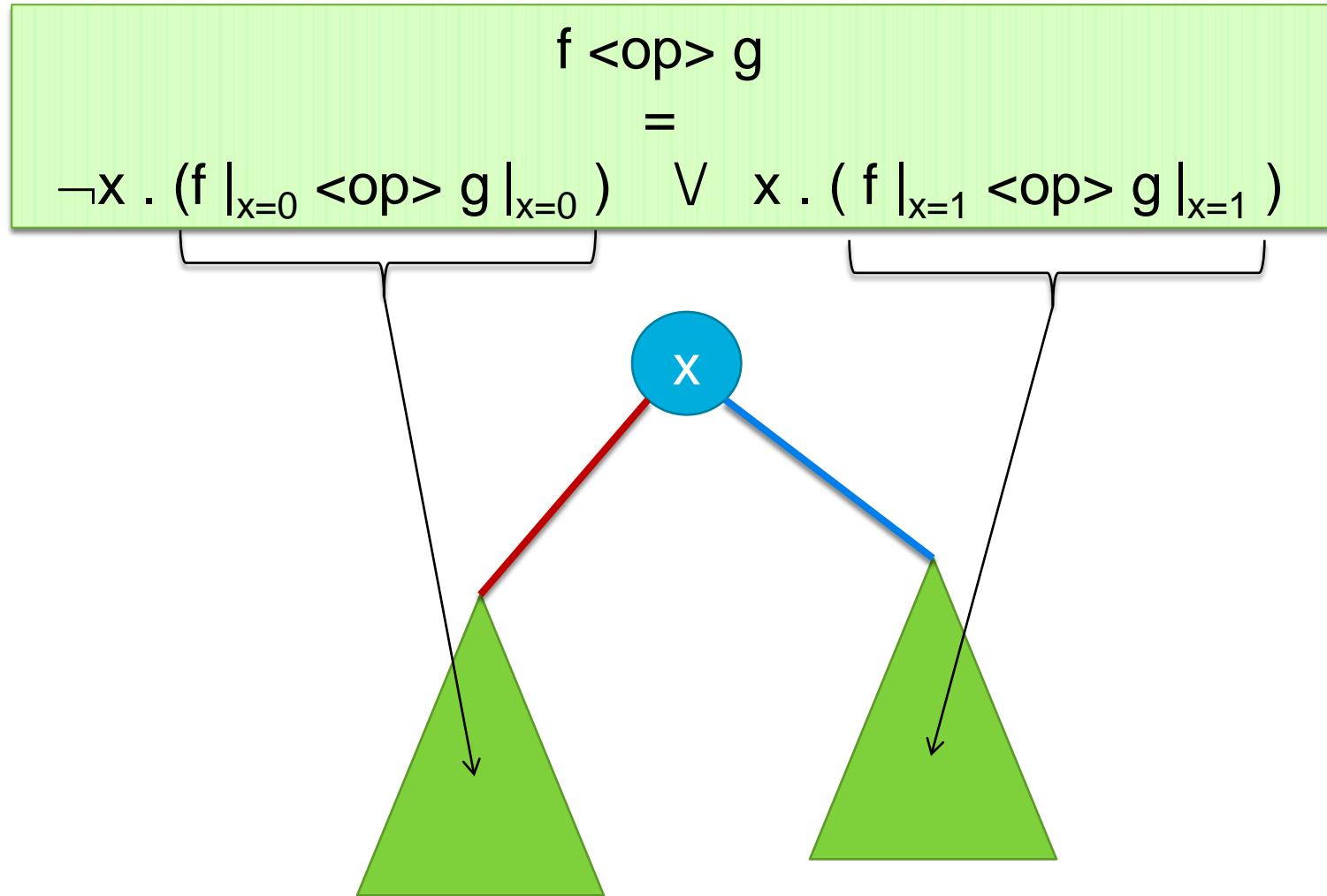
- So, given the BDDs of  $f$  and  $g$ , how to construct the BDD of  $f \langle \text{op} \rangle g$  ?
- There is this '*Shannon expansion*' :

$$\begin{aligned} f \langle \text{op} \rangle g \\ = \\ \neg x . (f|_{x=0} \langle \text{op} \rangle g|_{x=0}) \vee x . (f|_{x=1} \langle \text{op} \rangle g|_{x=1}) \end{aligned}$$

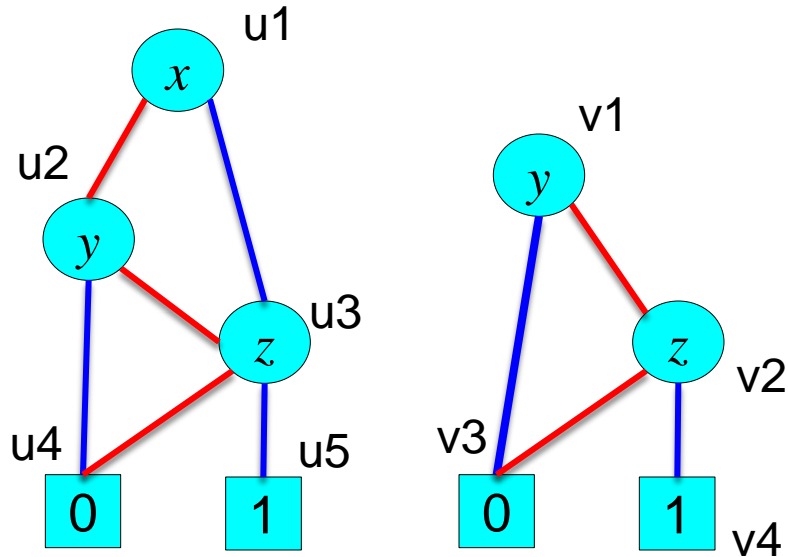
- This tells us how to implement “apply” recursively !

Detail, see LN.

# Apply



# Example



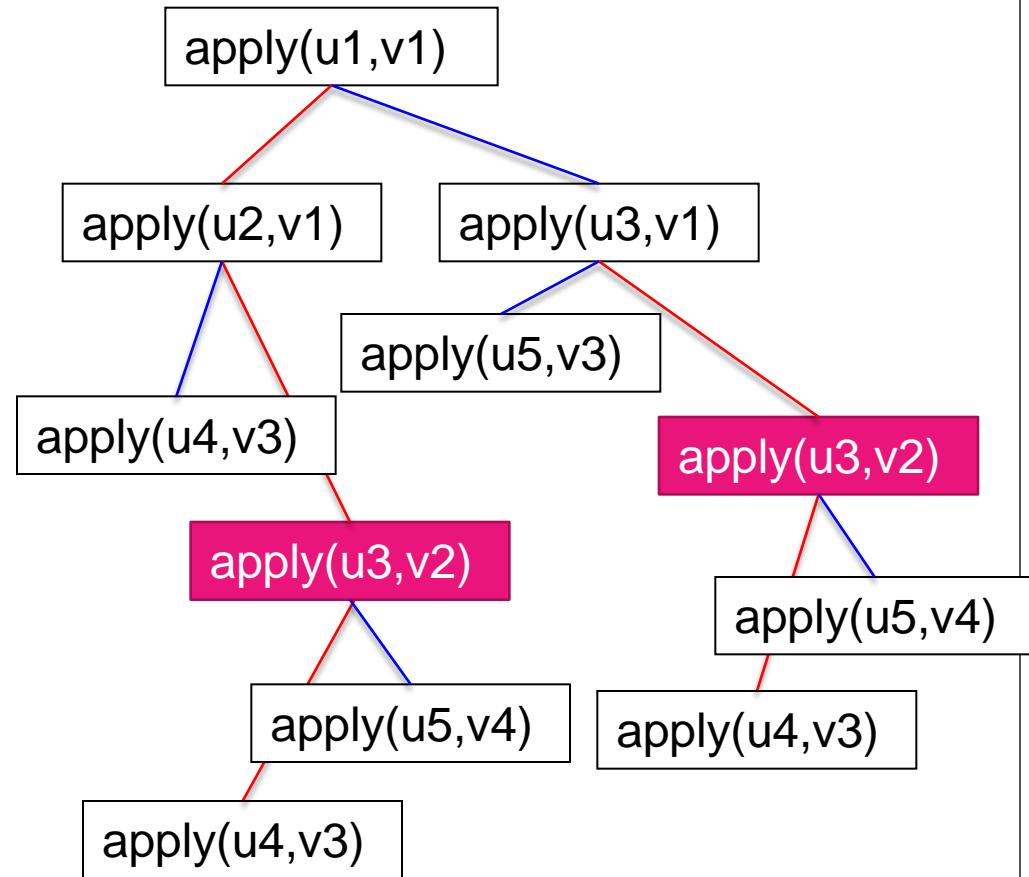
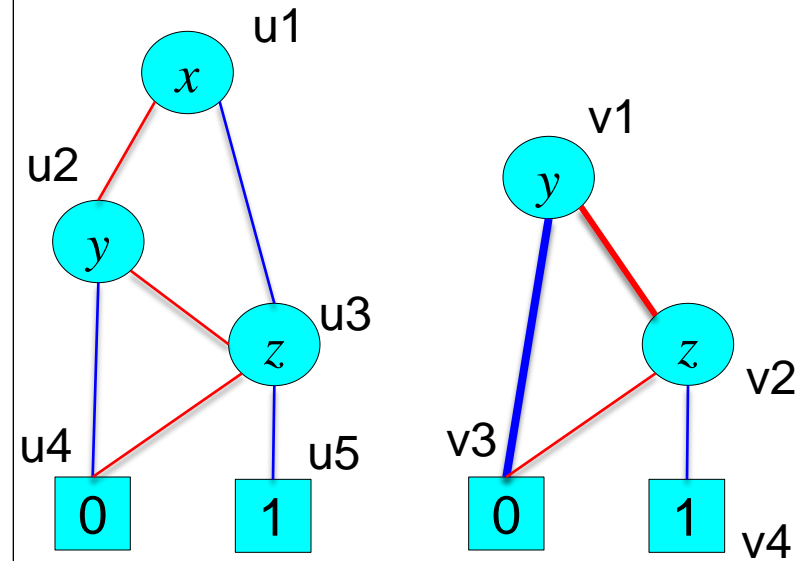
We'll do this by hand.

*We name the nodes, just so that we can refer to them.*

$$\begin{aligned} f \text{ and } g \\ = \\ \neg x . (f|_{x=0} \text{ and } g|_{x=0}) \quad \vee \quad x . (f|_{x=1} \text{ and } g|_{x=1}) \end{aligned}$$



# Example



*Repeated call in recursion! To avoid this, maintain a table to keep track of already computed results.*

# Satisfy and Compose

- Compose, constructed through :

$$f_1|_{x=f_2} = f_2 \cdot f_1|_{x=1} \vee \neg f_2 \cdot f_1|_{x=0}$$

- In a reduced graph of a satisfiable formula, every non-terminal node must have both leaf-0 and leaf-1 as descendants.

It follows that satisfy-one can be implemented in  $O(n)$  time.

# And substitution...

- Recall in CTL model checking, e.g. to the set of states satisfying **EX** p is calculated by constructing this formula:

$$\boxed{\exists x', y' :: R \wedge W_p [x', y' / x, y]}$$

So, how to we construct the BDD representing e.g.  $f[x', y' / x, y]$  ?

- Just replace  $x, y$  in the BDD with  $x', y'$ , assuming this does not violate the BDD's ordering constraint (e.g. if  $x < y$  but  $x' > y'$ ). Else use compose.

# The cost of various operations

- *Reduce*  $f$   $O(|G| \log|G|)$

where  $G$  is the graph of  $f$ 's BDD.

- *Apply*  $f_1 \text{ <op> } f_2$   $O(|G1| + |G2|)$
- *Restrict*  $f|_{x=b}$   $O(|G| \log|G|)$
- *Compose*  $f_1|_{x=f_2}$   $O(|G1|^2 + |G2|)$
- *Satisfy-one*  $O(n)$

$n$  is the number of parameters in the target boolean function.