

# NSWI101: SYSTEM BEHAVIOUR MODELS AND VERIFICATION

## 5. OBDD, LATTICES AND FIXPOINTS

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Distributed and  
Dependable  
Systems



- Ordered Binary Decision Diagrams (OBDDs)
- Lattices
- Fixpoints

## Explicit model checking

- each particular state of model is *explicitly* represented in memory
- model is explored state-by-state

## Symbolic model checking

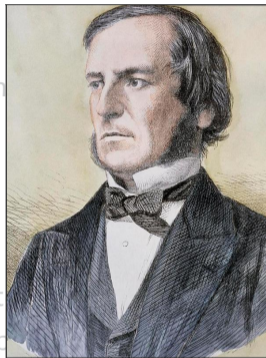
- based on manipulation with **Boolean formulae**
- operates on entire sets of states rather than individual states
- usually substantial reduction of time and memory consumption

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George Boole (1815–1864)  
English mathematician,  
philosopher and logician

Canonical representation for Boolean formulae

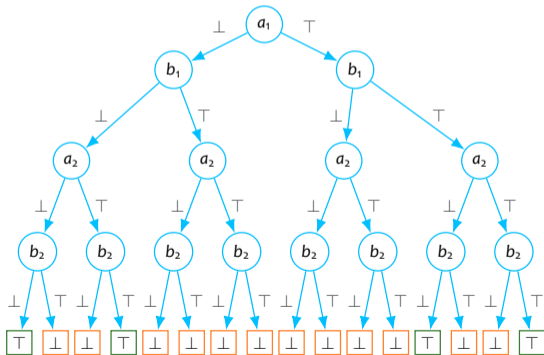
- often substantially more compact than traditional normal forms (CNF, DNF)
- variety of applications:
  - symbolic simulation
  - verification of combinatorial logic
  - verification of finite-state concurrent systems

Based on binary decision trees

# BINARY DECISION TREE

Binary tree with edges directed from root to leaves

- each node level associated with one particular variable
  - the same variable ordering on each path from root to leaf
- one edge from each node represent  $\top$  while the other represent  $\perp$
- terminal nodes (leaves) correspond to final decision –  $\top$  or  $\perp$



# BINARY DECISION TREE

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- Every Boolean formula can be represented by binary decision tree
- Every binary decision tree represents a Boolean formula
- To decide upon value of formula upon given variable assignment, proceed from BDT root to leaf and follow edges according to values assigned to particular variables
- BDTs are not very concise representation of Boolean formulae – essentially same as truth tables, i.e., exponential in number of variables
- Lots of redundancy present in BDT usually

# BINARY DECISION DIAGRAM

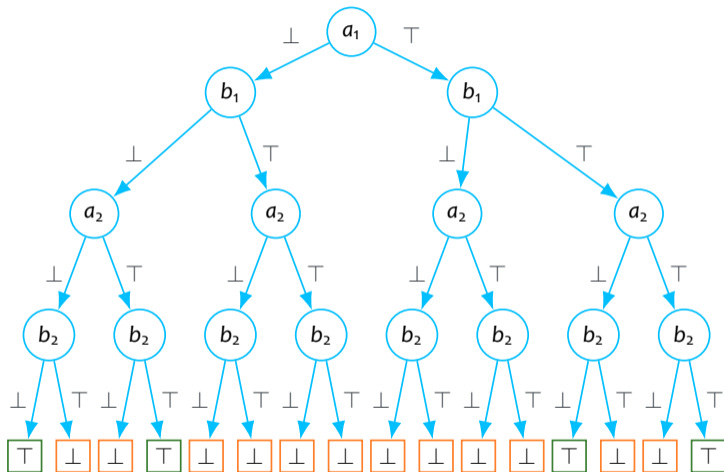
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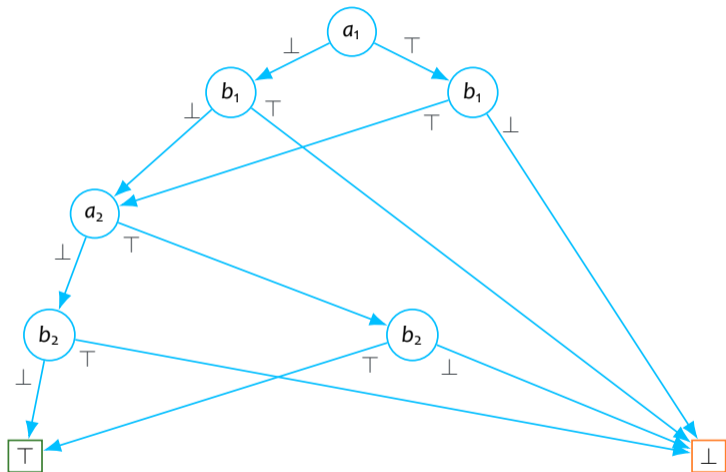
Redundancies in BDT:

- Many terminal symbols with just two different values –  $\perp$  and  $\top$
- Usually several sets of isomorphic sub-trees that can be merged
- Two sub-trees are isomorphic if:
  - their roots represent the same variable
  - edges originating in them lead to states representing the same variables
  - the edges are pair-wise labelled with the same values
- After removal and merge of nodes from two points above, redundant tests – both edges from node lead to the same target node – can appear and can be removed

Result is not tree anymore, but *directed acyclic graph* (DAG)



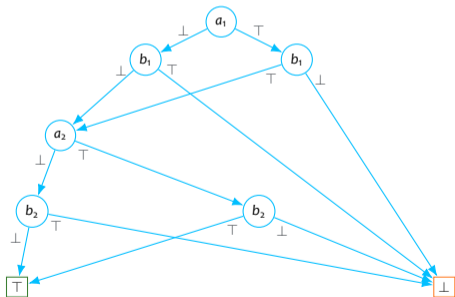




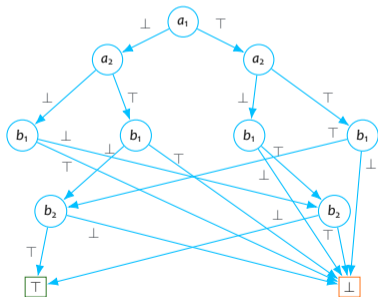
# VARIABLE ORDERING

Variable ordering – the order variables are checked on each path from root to leaf – influences size of OBDD substantially:

$$a_1 < b_1 < a_2 < b_2$$



$$a_1 < a_2 < b_1 < b_2$$

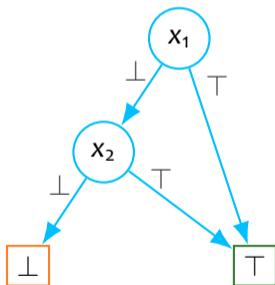


- For our n-bit comparator, OBDD size ranges from linear ( $3n + 2$ ) in optimal case to exponential ( $3 * 2^n - 1$ ) in worst case
- In general finding optimal (w.r.t. OBDD size) ordering is not feasible – even checking that particular ordering is optimal is NP-complete
- There are many functions for which every ordering results exponentially large OBDD
  
- Fortunately there are heuristics that help
- Using OBDD for representation of Boolean functions (and sets of states, in turn) is usually highly efficient:
  - related variables “close together”
  - depth-first traversal
  - dynamic reordering

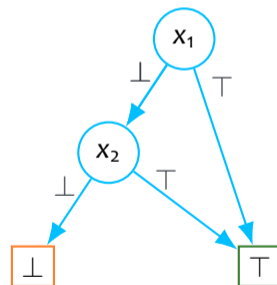
- For practical use (to exploit efficiency) we need to perform logical operations just upon OBDDs, not using their “textual” form
- Required operations: restriction, negation, conjunction, and disjunction
  - other operations (e.g., quantification) can be re-written using just these

Restriction refers to fixing variable to particular value ( $\top$  or  $\perp$ )

$$f_1 : x_1 \vee x_2$$

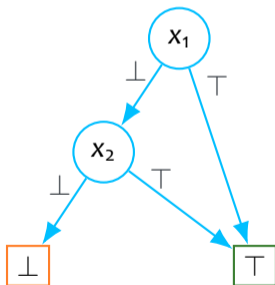


$$f_1|_{x_1=\perp}$$

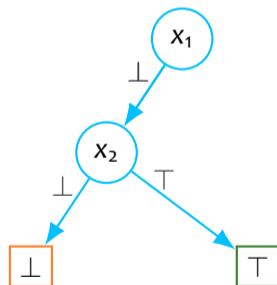


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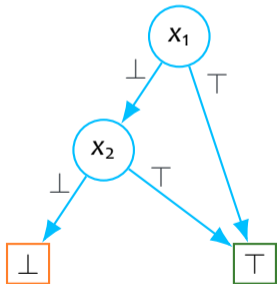


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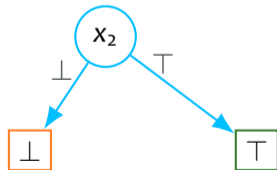


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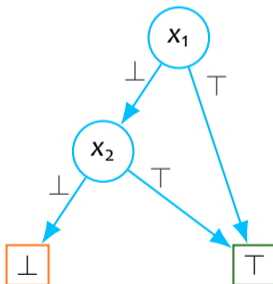
$$f_1|_{x_1=\perp}$$





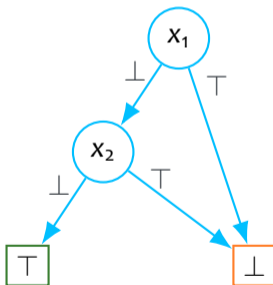
Performing *negation* is straightforward by swapping terminals

$$f_1 : x_1 \vee x_2$$



Performing *negation* is straightforward by swapping terminals

$$\neg f_1 : \neg(x_1 \vee x_2)$$



Let  $*$  be arbitrary binary logical operation, e.g. conjunction

Notation:

- $f, f'$  – Boolean functions to be combined by  $*$
- $v, v'$  – roots of OBDDs representing  $f, f'$ , respectively
  - both OBDDs respect the same variable ordering
- $x_v$  – variable associated with non-terminal vertex  $v$

## LOGICAL OPERATIONS – GENERAL CASE

- If  $v, v'$  are both terminals:  $f * f' = \text{value}(v) * \text{value}(v')$
- If  $v, v'$  are both non-terminals and  $x_v = x_{v'}$ :  

$$f * f' = (\neg x_v \wedge (f|_{x_v=\perp} * f'|_{x_v=\perp})) \vee (x_v \wedge (f|_{x_v=\top} * f'|_{x_v=\top}))$$
- If  $v$  is non-terminal and  $v'$  is either non-terminal and  $x_v < x'_{v'}$  or  $v'$  is terminal:  

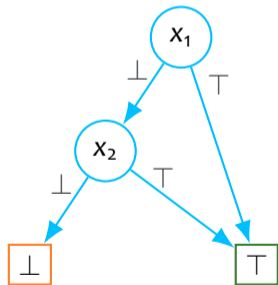
$$f * f' = (\neg x_v \wedge (f|_{x_v=\perp} * f')) \vee (x_v \wedge (f|_{x_v=\top} * f'))$$
- Symmetrically, if  $v'$  is non-terminal and  $v$  is either non-terminal and  $x_v > x'_{v'}$  or  $v$  is terminal:  

$$f * f' = (\neg x'_{v'} \wedge (f * f'|_{x'_{v'}=\perp})) \vee (x'_{v'} \wedge (f * f'|_{x'_{v'}=\top}))$$
- Split into sub-problems and solved by recursion
- To prevent exponential complexity, dynamic programming to be used yielding polynomial algorithm

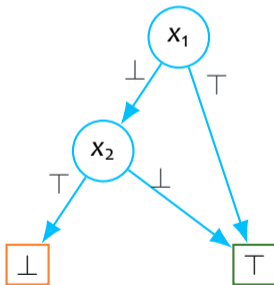
## LOGICAL OPERATIONS – CONJUNCTION

Conjunction of two OBDDs:  $f_1 \wedge f_2 = (x_1 \vee x_2) \wedge (x_1 \vee \neg x_2)$

$f_1 : x_1 \vee x_2$



$f_2 : x_1 \vee \neg x_2$



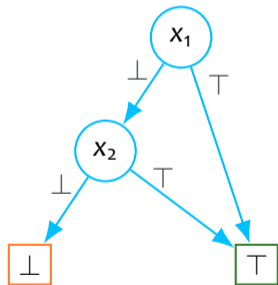
$f_1 \wedge f_2$



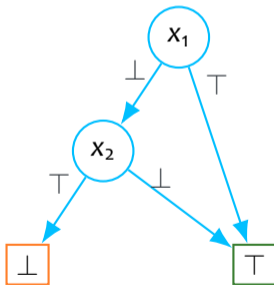
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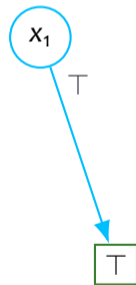
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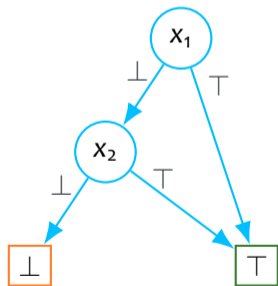
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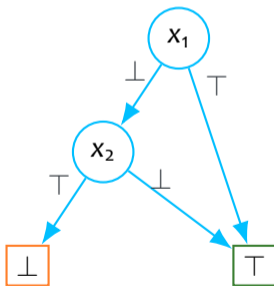
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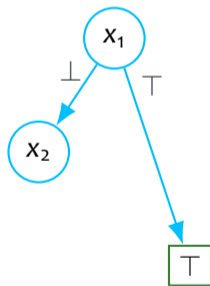
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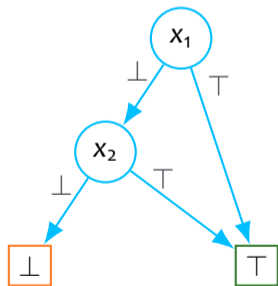
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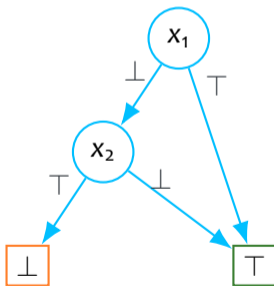
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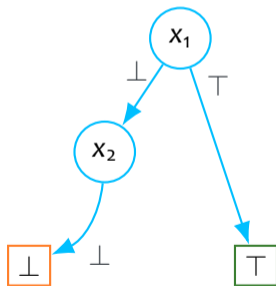
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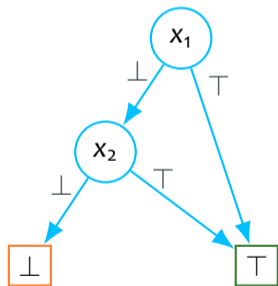




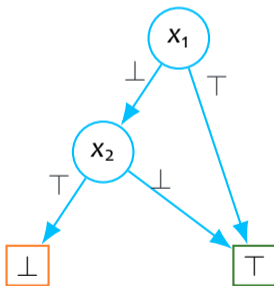
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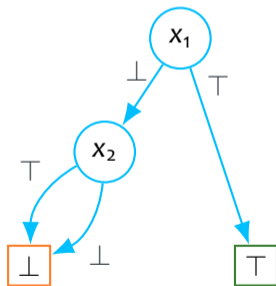
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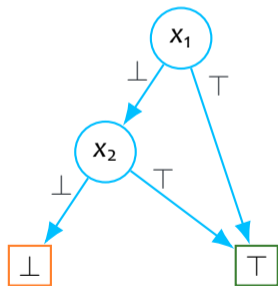


$f_1 \wedge f_2$

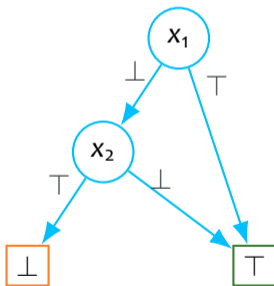


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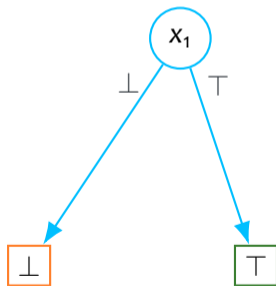
$f_1 : x_1 \vee x_2$



$f_2 : x_1 \vee \neg x_2$



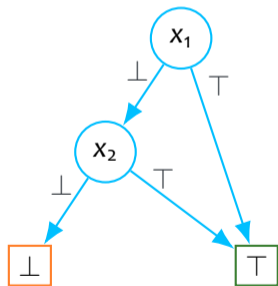
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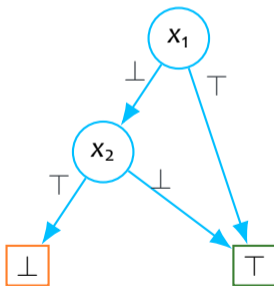
# LOGICAL OPERATIONS – DISJUNCTION

Disjunction of two OBDDs:  $f_1 \vee f_2 = (x_1 \vee x_2) \vee (x_1 \vee \neg x_2)$

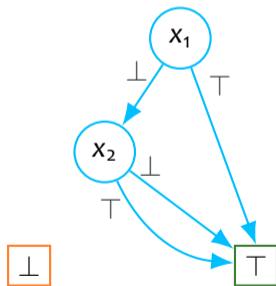
$f_1 : x_1 \vee x_2$



$f_2 : x_1 \vee \neg x_2$

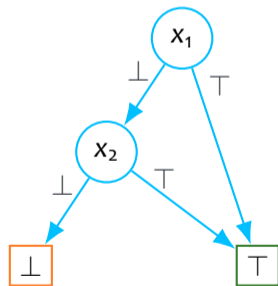


$f_1 \vee f_2$

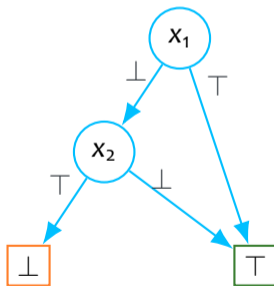


Disjunction of two OBDDs:  $f_1 \vee f_2 = (x_1 \vee x_2) \vee (x_1 \vee \neg x_2)$

$f_1 : x_1 \vee x_2$



$f_2 : x_1 \vee \neg x_2$



$f_1 \vee f_2$



Quantification of Boolean formula does not introduce greater expressive power:

- $\exists x : f \leftrightarrow f|_{x=\perp} \vee f|_{x=\top}$
- $\forall x : f \leftrightarrow f|_{x=\perp} \wedge f|_{x=\top}$

However, it is convenient in many cases

Let  $Q$  be  $n$ -ary relation over  $\{0, 1\}$

- $Q$  can be represented by OBDD using its characteristic function:  
 $f_Q(x_1, \dots, x_n) = 1 \equiv Q(x_1, \dots, x_n)$

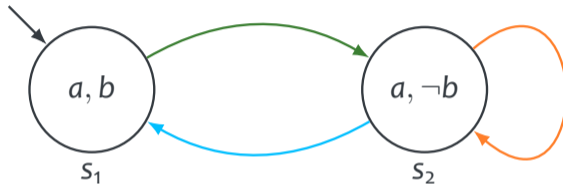
Let  $Q$  be  $n$ -ary relation over finite domain  $D$

- W.l.o.g. assume  $D$  has  $2^m$  elements for some  $m > 0$
- $D$  can be encoded using bijection:  $\phi : \{0, 1\}^m \mapsto D$
- Define relation  $Q_b$  of arity  $m * n$ :  $Q_b(\langle x_1 \rangle, \dots, \langle x_n \rangle) = Q(\phi(\langle x_1 \rangle), \dots, \phi(\langle x_n \rangle))$ 
  - $\langle x_i \rangle$  is vector of  $m$  Boolean variables encoding variable  $x_i$
- $Q$  can be represented as OBDD using characteristic function for  $Q_b$

Let  $M = (S, I, R, L)$  be Kripke structure:

- Sets of states  $S, I: \phi : \{0, 1\}^m \mapsto S$ , assuming  $2^m$  states for some  $m$
- Transition relation  $R$ : using characteristic function  $f_{R_b}$  of  $R_b(\langle x \rangle, \langle x' \rangle)$
- Labelling function  $L$ :
  - in contrast to usual direction of mapping states to subset of atomic proposition satisfied in particular states, inverse mapping used here
  - each atomic proposition corresponds to subset of states satisfying it:  
 $L_p = \{s \in S \mid p \in L(s)\}$
  - OBDDs for each one created using its characteristic function

$x$   
 $s_1 : 0$   
 $s_2 : 1$



$I : \neg x$

$R : (\neg x \wedge x') \vee (x \wedge x') \vee (x \wedge \neg x')$

$L : a \mapsto \{s_1, s_2\}, b \mapsto \{s_1\}$

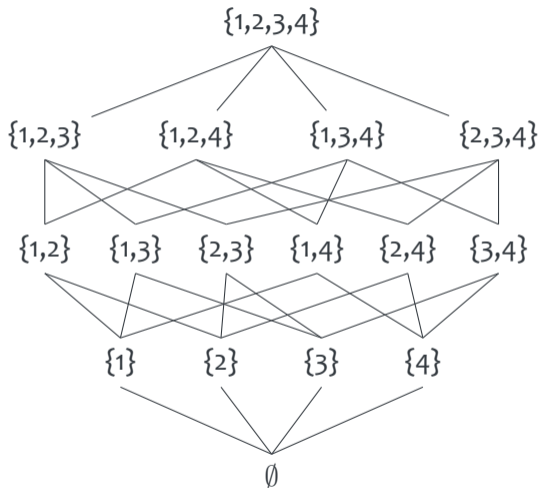
$L_a = \{0, 1\}, L_b = \{0\}$



- We have Kripke structure represented as OBDDs
  - but we still do not know how to use them for model checking
- We need to define more structures allowing us to model-check
  - lattices
  - fixpoints

- Lattice  $L$  is structure consisting of partially ordered set  $S$  of elements where every two elements have
  - unique *supremum* (least upper bound or join) and
  - unique *infimum* (greatest lower bound or meet)
- Set  $P(S)$  of all subsets of  $S$  forms complete lattice
- Each element  $E \in L$  can also be thought as *predicate* on  $S$
- Greatest element of  $L$  is  $S$  ( $\top$ , true)
- Least element of  $L$  is  $\emptyset$  ( $\perp$ , false)
- $\tau : P(S) \mapsto P(S)$  is called *predicate transformer*

# EXAMPLE: SUBSET LATTICE OF $\{1, 2, 3, 4\}$



Let  $\tau : P(S) \mapsto P(S)$  be predicate transformer

- $\tau$  is *monotonic*  $\equiv Q \subseteq R \implies \tau(Q) \subseteq \tau(R)$
- $Q$  is *fixpoint* of  $\tau \equiv \tau(Q) = Q$

**Theorem (Knaster-Tarski):** A monotonic predicate transformer  $\tau$  on  $P(S)$  always has the least fixpoint  $\mu Z.\tau(Z)$ , and the greatest fixpoint  $\nu Z.\tau(Z)$ .

- $\mu Z.\tau(Z) = \bigcap \{Z \mid \tau(Z) \subseteq Z\}$
- $\nu Z.\tau(Z) = \bigcup \{Z \mid \tau(Z) \supseteq Z\}$

We write  $\tau^i(Z)$  to denote  $i$  applications of  $\tau$  to  $Z$ :

- $\tau^0(Z) = Z$
- $\tau^{i+1}(Z) = \tau(\tau^i(Z))$

**Lemma:** If  $\tau$  is monotonic, then for each  $i$ :

- $\tau^i(\text{false}) \subseteq \tau^{i+1}(\text{false})$
- $\tau^i(\text{true}) \supseteq \tau^{i+1}(\text{true})$

**Lemma:** If  $\tau$  is monotonic and  $S$  is finite, then:

- $\exists i_0 \geq 0 : \forall i \geq i_0 : \tau^i(\text{false}) = \tau^{i_0}(\text{false})$
- $\exists j_0 \geq 0 : \forall j \geq j_0 : \tau^j(\text{true}) = \tau^{j_0}(\text{true})$

**Lemma:** If  $\tau$  is monotonic and  $S$  is finite, then:

- $\exists i_0 : \mu Z. \tau(Z) = \tau^{i_0}(\text{false})$
- $\exists j_0 : \nu Z. \tau(Z) = \tau^{j_0}(\text{true})$

Knaster-Tarski theorem for finite lattices directly follows from these lemmas

Kripke structures are finite-state  $\Rightarrow$  only finite versions of the theorem needed.

The least and greatest fixpoints of a monotonic predicate transformer can be computed easily (next lecture)