

Handling Large State Spaces

State Explosion

- If M has k state variables, then it has 2^k states
- Not all these states are reachable
- Not all state variables are relevant for a property we wish to prove

Representation

- Symbolic – we will never actually generate the explicit state space
- Reduced – throw out those state variables that are inconsequential

Decision strategies

- Proving the property on an abstraction of M may be sufficient
- Proving the property assuming all states are reachable may be sufficient

More on scalability

- **BDD, SAT, SMT**
 - Not good enough for many of the state spaces where we wish to use formal methods

OPTIONS (we will elaborate each of these)

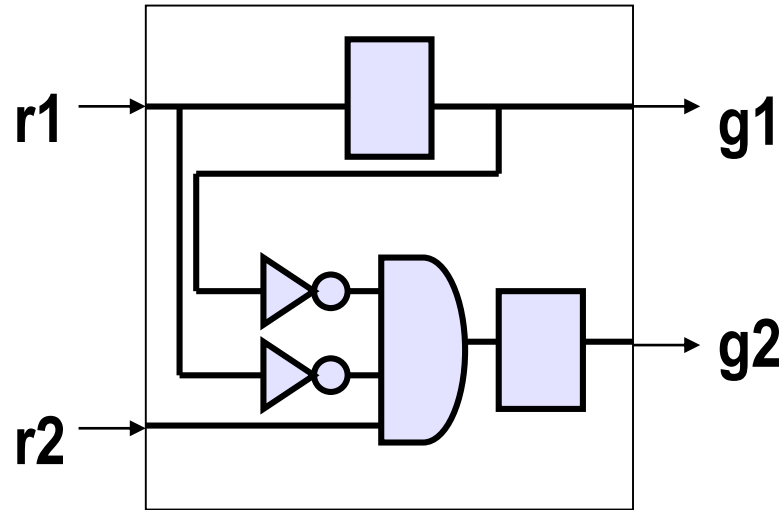
- **BOUNDED SEARCH**
 - In many cases we may know an upper-bound on the length of potential counter-examples
 - We can unfold only up to that depth
- **INDUCTION**
 - We can inductively prove certain properties with limited unfolding
- **ABSTRACTION – REFINEMENT**
 - We reduce the complexity of the STS by dropping some of its variables and prove that the abstraction is safe

BOUNDED MODEL CHECKING

Bounded Model Checking

- **Represent sets of states and the transition relation as Boolean logic formulas**
- **Instead of computing the fixpoints, unroll the transition relation up to certain fixed bound and search for violations of the property within that bound**
- **Transform this search to a Boolean satisfiability problem and solve it using a SAT solver**

Example: *Bound=2*



Is there a witness of length=2?

Clauses from Transition Relation:

$$C_1^1: r2^0 \wedge \neg r1^0 \wedge \neg g1^0 \Rightarrow g2^1$$

$$C_2^1: r1^0 \Rightarrow g1^1$$

Clauses from Initial State:

$$I: g2^0 \wedge \neg g1^0$$

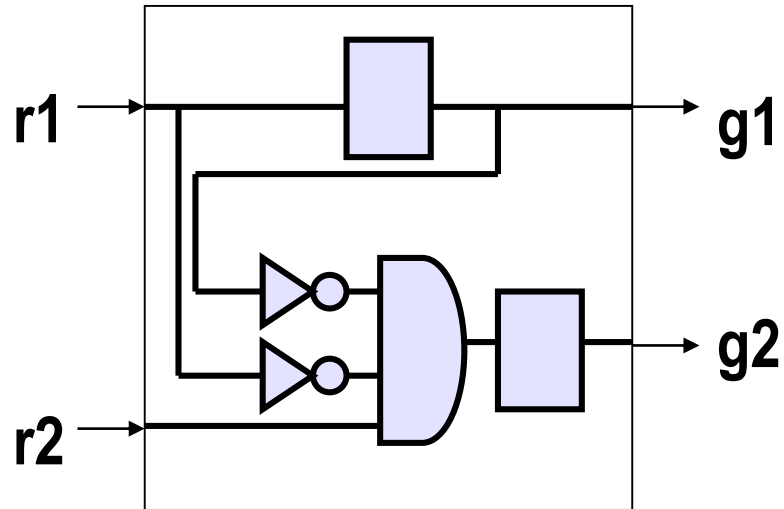
Clauses from Property: $F(r1 \wedge (\neg Xg1 \vee \neg XXg1))$

$$Z^1: r1^0 \wedge \neg g1^1$$

SAT Check: Is $Z^1 \wedge I \wedge C_1^1 \wedge C_2^1$ satisfiable?

Answer: No, since Z^1 conflicts with C_2^1

Example: *Bound=3*



Is there a witness of length=3?

Clauses from Transition Relation:

C_1^1, C_2^1 : from previous iteration

$C_1^2: r2^1 \wedge \neg r1^1 \wedge \neg g1^1 \Rightarrow g2^2$

$C_2^2: r1^1 \Rightarrow g1^2$

Clauses from Initial State:

$I: g2^0 \wedge \neg g1^0$

Clauses from Property: $F(r1 \wedge (\neg Xg1 \vee \neg XXg1))$

$Z^2: (r1^0 \wedge (\neg g1^1 \vee \neg g1^2)) \vee (r1^1 \wedge \neg g1^2)$

SAT Check: Is $Z^2 \wedge I \wedge C_1^1 \wedge C_2^1 \wedge C_1^2 \wedge C_2^2$ satisfiable?

Yes: Witness: $r1^0 = 1, r1^1 = 0, g1^1 = 1, g1^2 = 0$, rest are don't cares

Conclusion: We have found a bug!!

What Can We Guarantee?

Note that we are checking only for bounded paths (paths which have at most $k+1$ distinct states)

- **So if the property is violated by only paths with more than $k+1$ distinct states, we would not find a counter-example using bounded model checking**
- **Hence if we do not find a counter-example using bounded model checking we are not sure that the property holds**

However, if we find a counter-example, then we are sure that the property is violated since the generated counter-example is never spurious (i.e., it is always a concrete counter-example)

Proving Correctness

If we can find a way to figure out when we should stop then we would be able to provide guarantee of correctness.

There is a way to define a *diameter* of a transition system so that a property holds for the transition system if and only if it is not violated on a path bounded by the diameter.

So if we do bounded model checking using the diameter of the system as our bound, then we can guarantee correctness if no counter-example is found.

Formal Methodology

Bound on path length k

Clauses describing the system M :

- **Initial state** : $I(s_1)$
- **Unrolled transition relation** : $\bigwedge_{i=1..k-1} T(s_i, s_{i+1})$

Loop clause $\text{loop}_k = \bigvee_{i=1..k} T(s_k, s_i)$

$[f]_{i,k}$ means that temporal property f is true at runs starting from s_i and provable in k BMC iterations.

For the property f to hold on the system $M \wedge [f]_{1,k}$ must be valid.

Translation of LTL to SAT

Xf is true at state s_i , iff **f** is provable starting from s_{i+1}

$$[Xf]_{i,k} = (i < k) \wedge [f]_{i+1,k}$$

Ff is true in state s_i , iff **f** is provable within k iterations from some future state s_j

$$[Ff]_{i,k} = \bigvee_{j=i..k} [f]_{j,k}$$

Gf is true in state s_i , iff **f** is true at all states reachable in k iterations and all paths loop

$$[Gf]_{i,k} = \bigwedge_{j=i..k} [f]_{j,k} \wedge \text{loop}_k$$

f U g is true at s_i , iff **g** is provable from some state reachable within k iterations and **f** is provable from all preceding states within k iterations

$$[f U g]_{i,k} = \bigvee_{j=i..k} ([g]_{j,k} \wedge \bigwedge_{n=i..j-1} [f]_{n,k})$$

ABSTRACTION REFINEMENT

Cone-of-influence reduction

Two state variables

- **b and d**

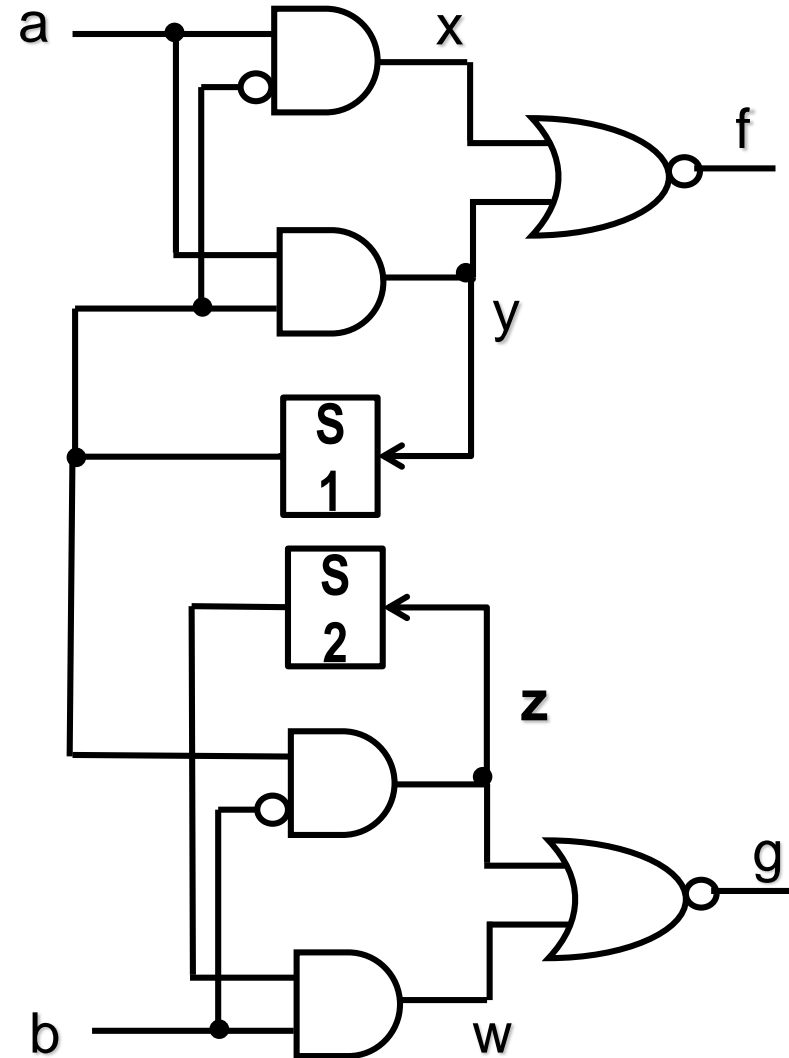
The value of f is influenced by:

- **Input a**
- **State $S1$**

The value of g is influenced by:

- **Input b**
- **State $S2$**
- **State $S1$, because $S2$ is influenced by it**
- **Input a , because $S1$ is influenced by it**

Computable using static analysis



Abstraction

Cone-of-influence reduction with respect to a property does not lose any relevant information

- The problem is that quite often COI is not enough

Abstractions further reduce the size of the state machine

What kind of abstractions do we want?

- Bugs must not escape detection.
- This is guaranteed by the following constraint:
 - Any run which exists in the original state machine must also exist in the abstract state machine
- This is achieved by *existential abstraction* of the transition relation

Existential Abstraction

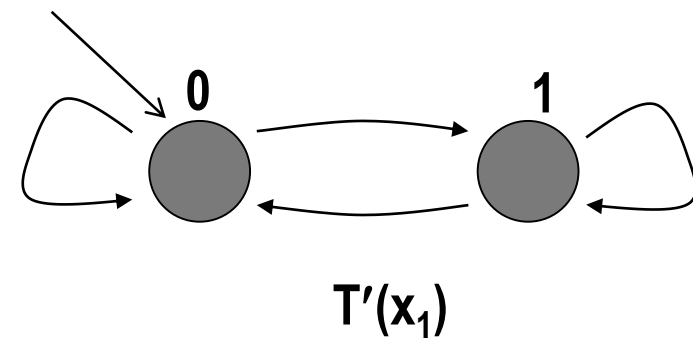
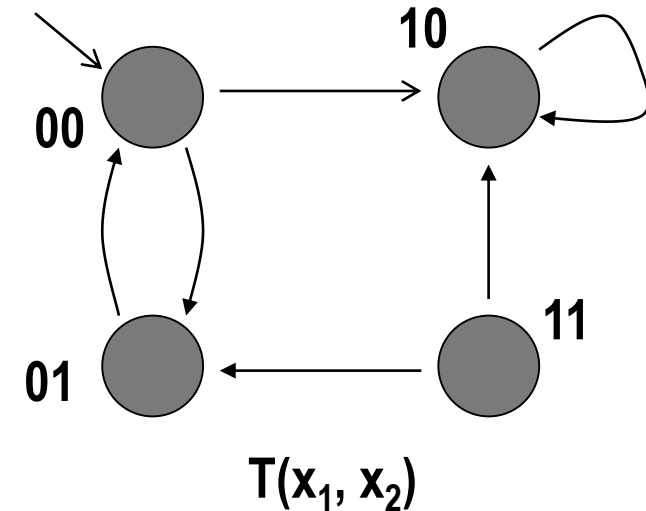
In this example, we eliminate x_2

- Let $h(s)$ denote the abstract state corresponding to a state s in the original machine
- Existential abstraction:

$$T(s_a, s_b) \Rightarrow T'(h(s_a), h(s_b))$$

- In other words:

$$T'(s_i, s_j) \Rightarrow \exists s_a, s_b T(s_a, s_b) \text{ such that } h(s_a) = s_i \text{ and } h(s_b) = s_j$$



Existential Abstraction

Corresponding to every run in the original state machine, we have a run in the abstract state machine

- **Therefore counterexamples in the original machine (if any) are preserved in the abstract state machine**
- **If a property holds on the abstract state machine, then it also holds in the original state machine**

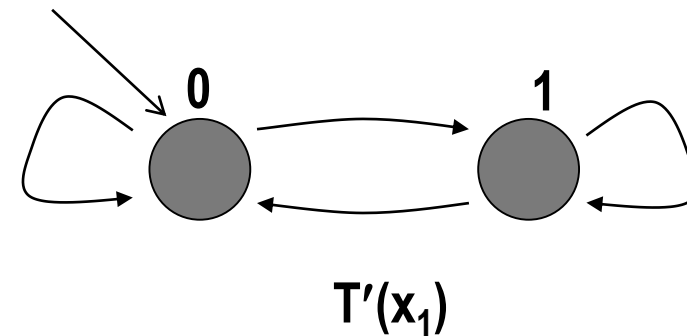
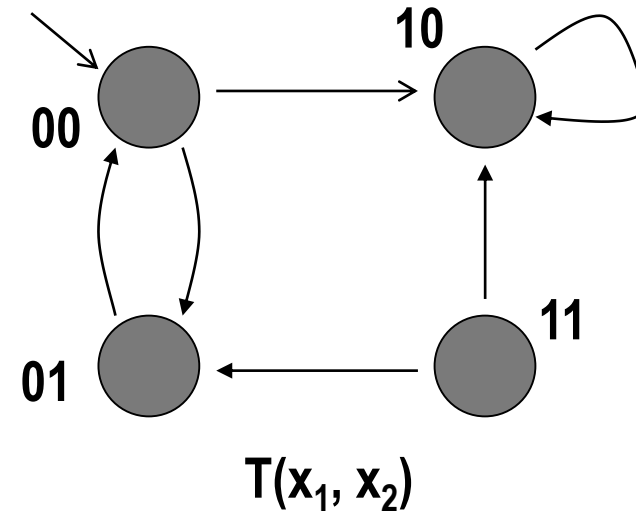
Problem: A counterexample found in the abstract state machine is not necessarily real

False counterexample

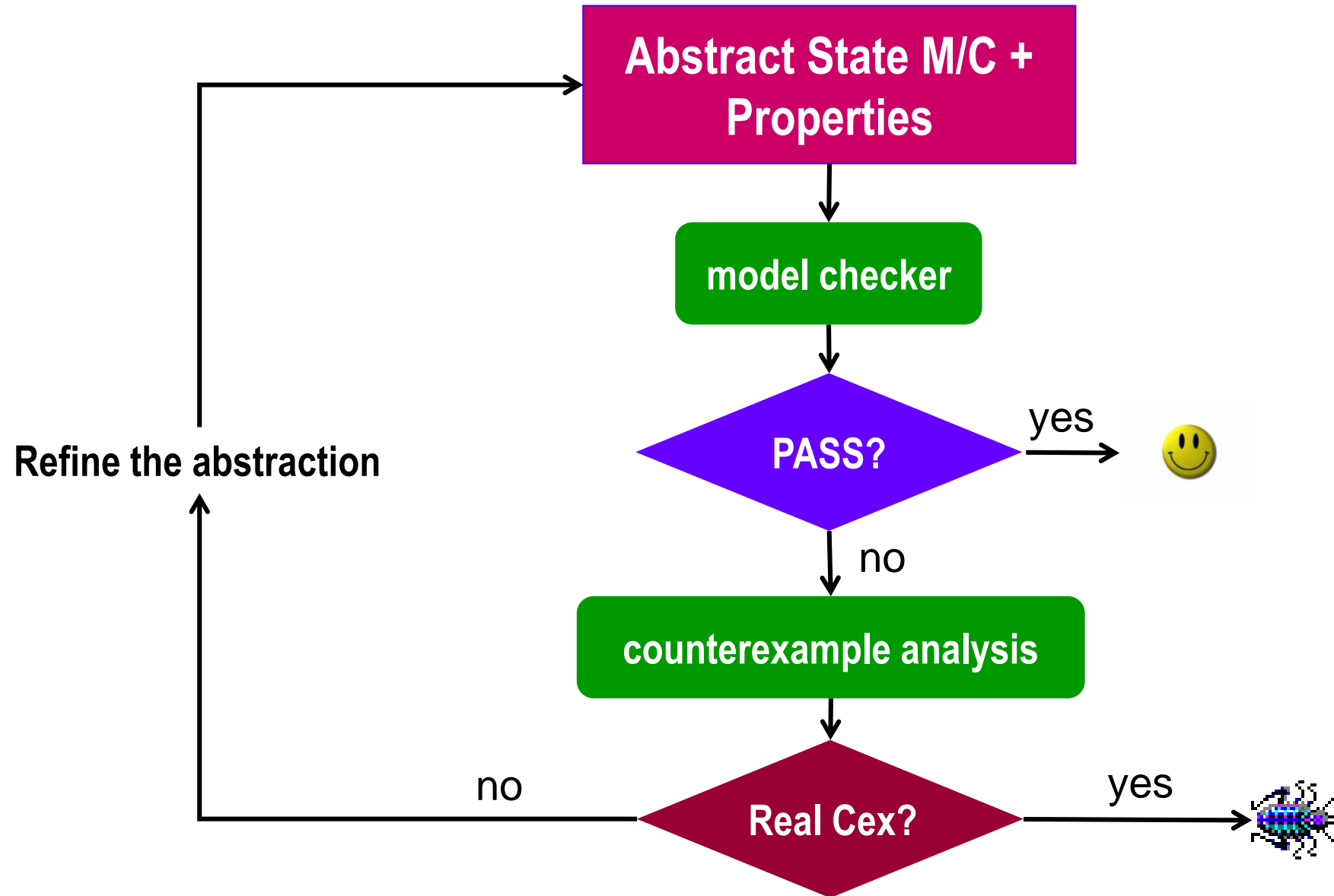
Consider the property

$$G(x_1 \Rightarrow G(x_1))$$

- Whenever x_1 goes high, it stays high
- This is true in the original state machine
(look at the reachable states only)
- *But it is false in the abstract state m/c*



Abstraction Refinement



Checking the Counterexample

Counterexample: (c_1, \dots, c_m)

- Each c_i is an assignment to the set of remaining state variables.

Concrete traces corresponding to the counterexample:

$$\varphi = I(s_1) \wedge \left(\bigwedge_{i=1}^{m-1} R(s_i, s_{i+1}) \right) \wedge \left(\bigwedge_{i=1}^m h(s_i) = c_i \right)$$

Initial State Unrolled Transition Relation Compliance with counterexample

The diagram shows the formula $\varphi = I(s_1) \wedge \left(\bigwedge_{i=1}^{m-1} R(s_i, s_{i+1}) \right) \wedge \left(\bigwedge_{i=1}^m h(s_i) = c_i \right)$ with three arrows pointing to its components. The first arrow points to $I(s_1)$ and is labeled 'Initial State'. The second arrow points to the transition relation part $\left(\bigwedge_{i=1}^{m-1} R(s_i, s_{i+1}) \right)$ and is labeled 'Unrolled Transition Relation'. The third arrow points to the counterexample assignment part $\left(\bigwedge_{i=1}^m h(s_i) = c_i \right)$ and is labeled 'Compliance with counterexample'.

Abstraction/Refinement with conflict analysis

- **Simulate counterexample on concrete model with SAT**
- **If the instance is unsatisfiable, analyze conflict**
- **Make visible one of the variables in the clauses that lead to the conflict**

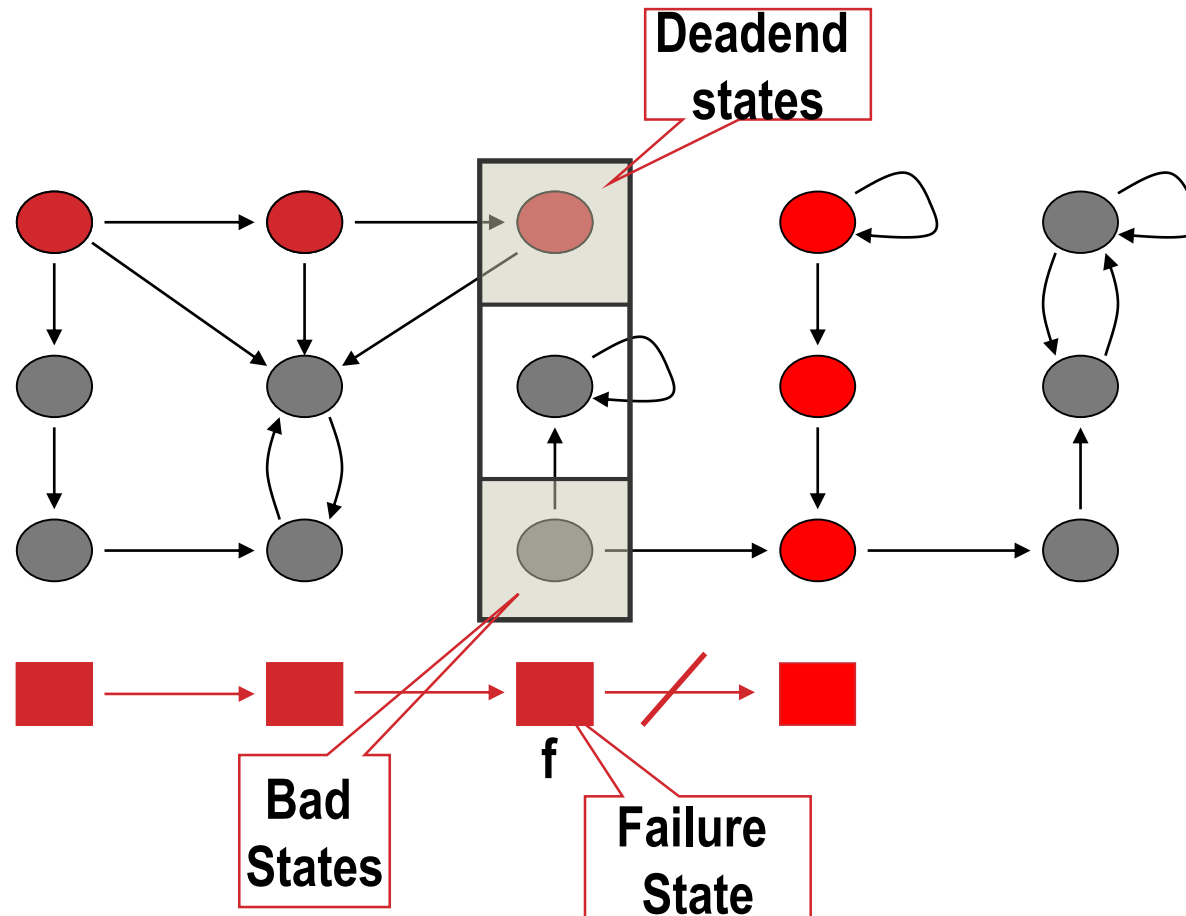
Source: Chauhan, Clarke, Kukula, Sapro, Veith, Wang, FMCAD 2002

Refinement

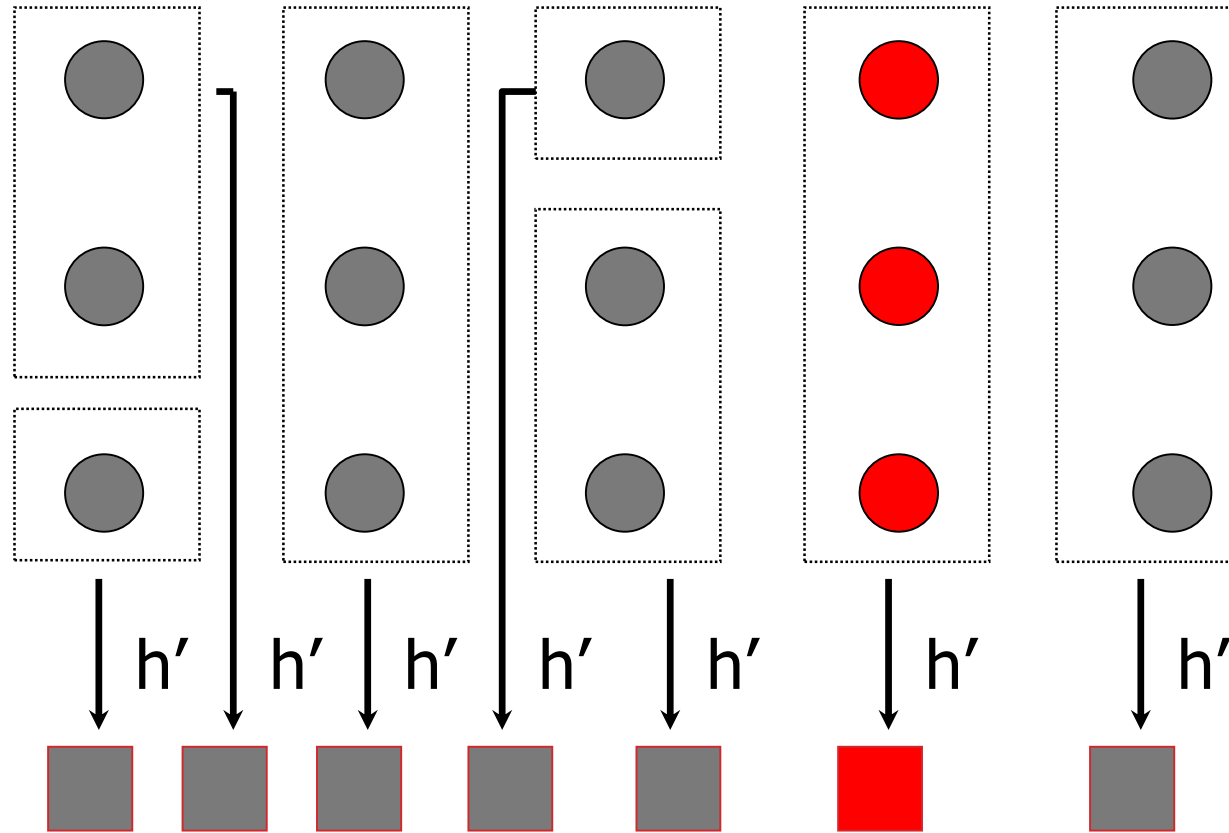
Problem: Deadend and Bad States are in the same abstract state.

Solution: Refine abstraction function.

The sets of Deadend and Bad states should be separated into different abstract states.

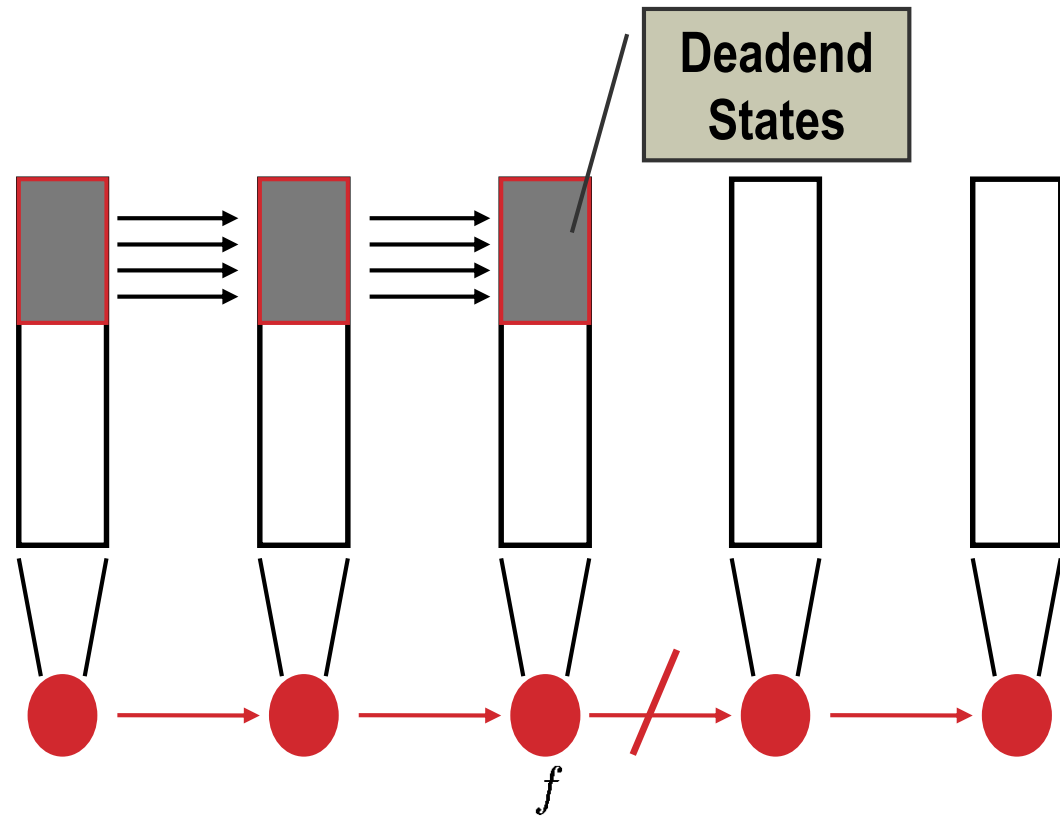


Refinement



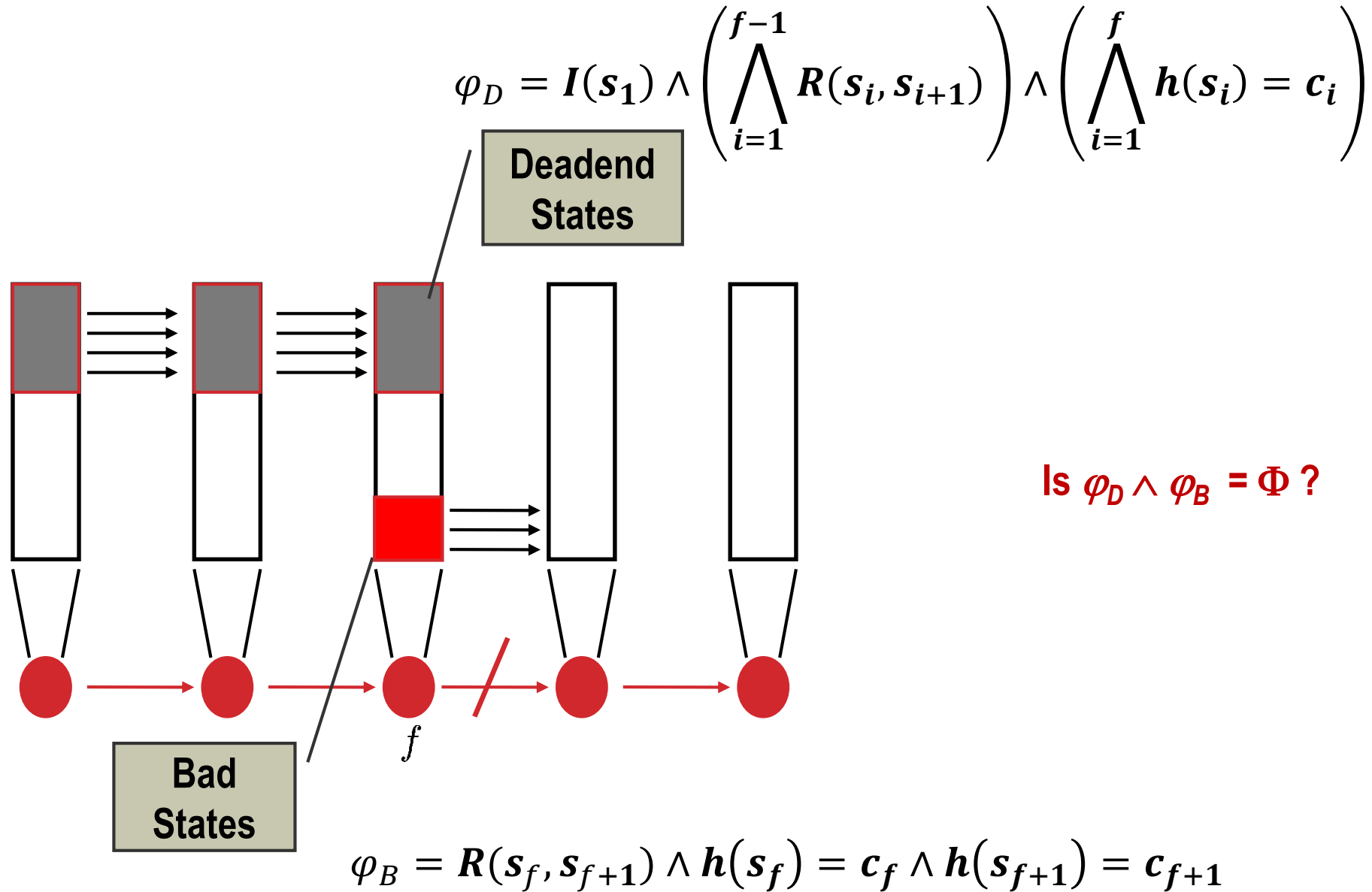
Refinement : h'

Refinement

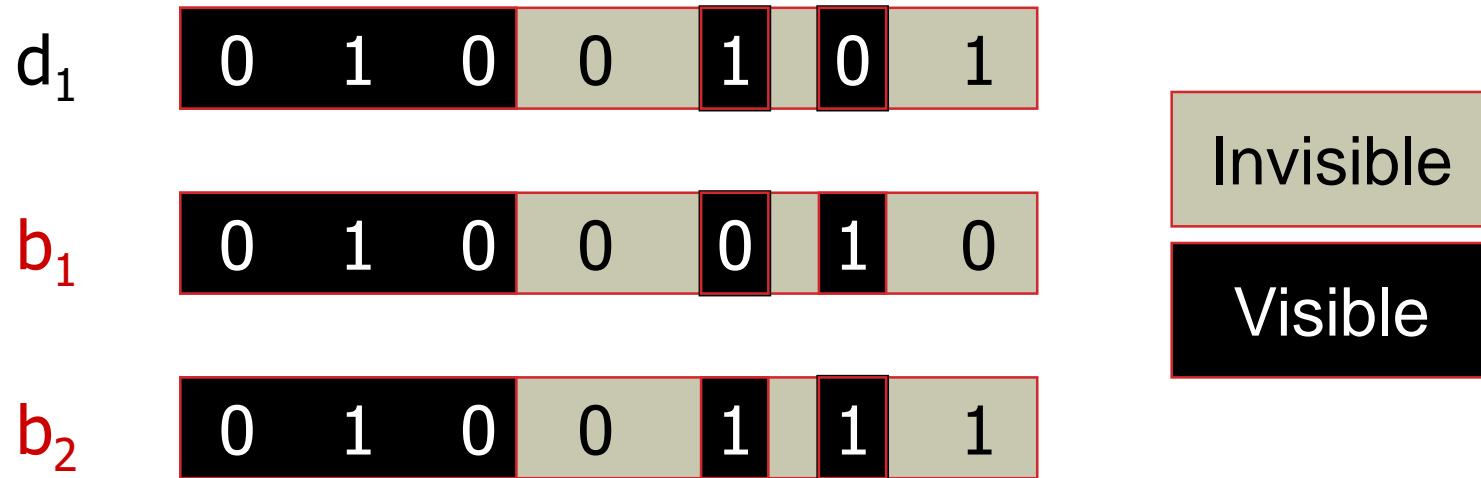


$$\varphi_D = I(s_1) \wedge \left(\bigwedge_{i=1}^{f-1} R(s_i, s_{i+1}) \right) \wedge \left(\bigwedge_{i=1}^f h(s_i) = c_i \right)$$

Refinement



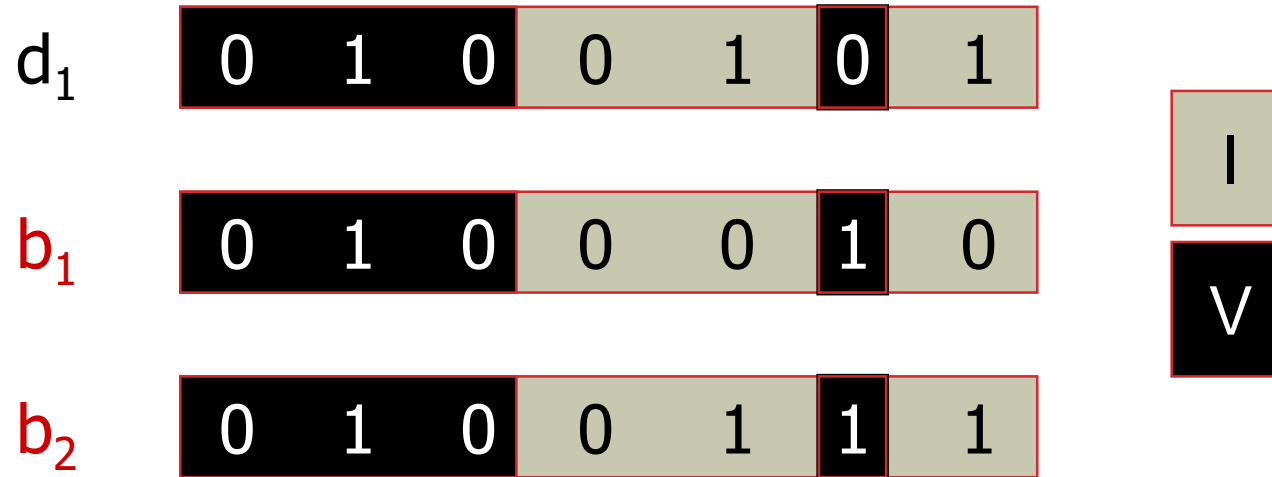
Refinement as Separation



**Refinement: Find subset U of I that separates between all pairs of dead-end and bad states.
Make them visible.**

U must be minimal !

Refinement as Separation



Refinement: Find subset U of I that separates between all pairs of dead-end and bad states.
Make them visible.

U must be minimal !

Refinement as Separation

The state separation problem

Input: Sets D, B

Output: Minimal $U \in I$ s.t.:

$$\forall d \in D, \forall b \in B, \exists u \in U. d(u) \neq b(u)$$

The refinement h' is obtained by adding U to V .

Separation methods

ILP-based separation

- Minimal separating set.
- Computationally expensive.

Decision Tree Learning based separation.

- Not optimal.
- Polynomial.