



**Systems and Software
Verification Laboratory**

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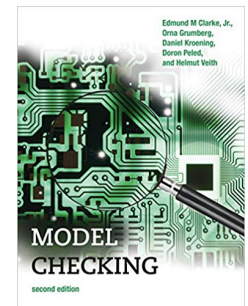
Detection of Software Vulnerabilities: Static Analysis (Part II)

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Static Analysis (Part II)

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 - Office: 2.28
 - Office hours: 15-16 Tuesday, 14-15 Wednesday
- References:
 - Clarke et al., *Model checking* (Chapter 14)
 - Cordeiro and Fischer: *Verifying multi-threaded software using smt-based context-bounded model checking*. ICSE 2011

*These slides are based on the lecture notes
“SAT/SMT-Based Bounded Model Checking of
Software” by Fischer, Parlato and La Torre*



Intended learning outcomes

- Introduce typical **BMC architectures** for verifying **software systems**

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SAT/SMT-based BMC tools for C

- CBMC (C Bounded Model Checker)
 - <http://www.cprover.org/>
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 - also SystemC frontend

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 - branched off CBMC, also (rudimentary) C++ frontend
- LLBMC (Low-level Bounded Model Checker)
 - <http://llbmc.org>
 - SMT-based (Boolector or STP)
 - uses LLVM intermediate language

⇒ share common high-level architecture

SAT/SMT-based BMC tools for C

Typical features:

- full language support
 - bit-precise operations, structs, arrays, ...
 - heap-allocated memory
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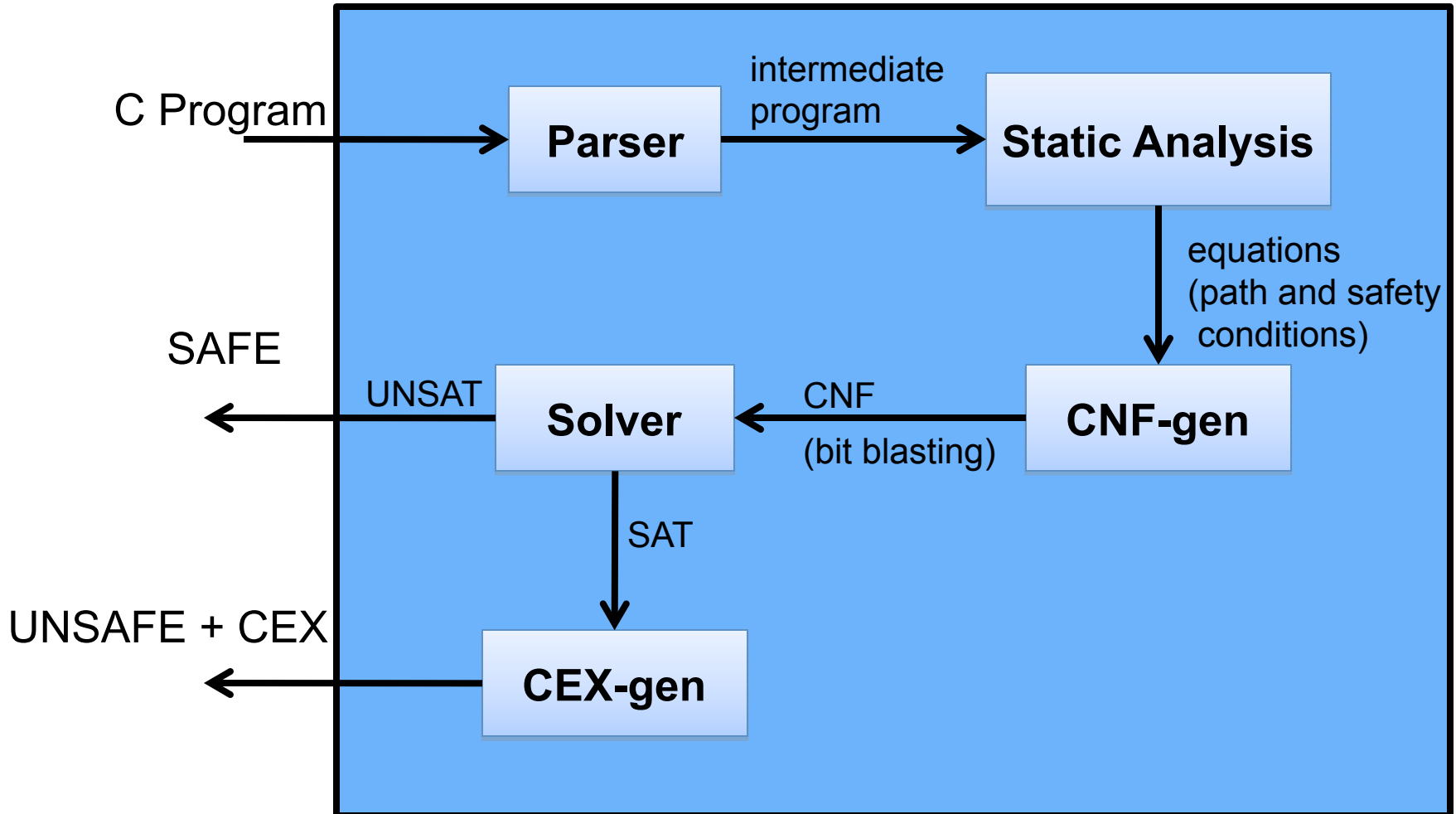
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- user-specified assertions and error labels
- non-deterministic modelling
 - nondeterministic assignments
 - assume-statements

SAT/SMT-based BMC tools for C

High-level architecture:



SAT/SMT-based BMC tools for C

General approach:

1. Simplify control flow
2. Unwind all of the loops
3. Convert into single static assignment (SSA) form
4. Convert into equations and simplify
5. (Bit-blast)
6. Solve with a SAT/SMT solver
7. Convert SAT assignment into a counterexample

Control flow simplifications

- remove all side effects
 - e.g., `j = ++i;` becomes `i = i + 1; j = i;`

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 - e.g., replace `for`, `do while` by `while`
 - e.g., replace `case` by `if`

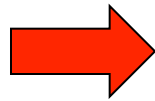
Control flow simplifications

- remove all side effects
 - e.g., `j = ++i`; becomes `i = i + 1; j = i`;
- simplify all control flow structures into core forms
 - e.g., replace `for`, `do while` by `while`
 - e.g., replace `case` by `if`
- make control flow explicit
 - e.g., replace `continue`, `break` by `goto`
 - e.g., replace `if`, `while` by `goto`

Control flow simplifications

Demo: `esbmc --goto-functions-only example-1.c`

```
int main() {  
  int i,j;  
  for(i=0; i<6; i++) {  
    j=i;  
  }  
  assert(j==i);  
  return j;  
}
```



```
main (c::main):  
  int i;  
  int j;  
  i = 0;  
  1: IF !(i < 6) THEN GOTO 2  
    j = i;  
    i = i + 1;  
    GOTO 1  
  2: ASSERT j == i  
    RETURN: j  
    END_FUNCTION
```

Loop unwinding

- all loops are “unwound”, i.e., replaced by several guarded copies of the loop body
 - same for backward **gotos** and recursive functions
 - can use different unwinding bounds for different loops
- ⇒ each statement is executed at most once

Loop unwinding

- all loops are “unwound”, i.e., replaced by several guarded copies of the loop body
 - same for backward **gotos** and recursive functions
 - can use different unwinding bounds for different loops
- ⇒ each statement is executed at most once
- to check whether unwinding is sufficient special “unwinding assertion” claims are added
- ⇒ if a program satisfies all of its claims and all unwinding assertions then it is correct!

Loop unwinding

```
void f(...) {  
    ...  
    while(cond) {  
        Body;  
    }  
    Remainder;  
}
```

Loop unwinding

```
void f(...) {  
    ...  
    if(cond) {  
        Body;  
        while(cond) {  
            Body;  
        }  
    }  
    Remainder;  
}
```

unwind one
iteration

Loop unwinding

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void f(...) {  
    ...  
    if(cond) {  
        Body;  
    }  
    if(cond) {  
        Body;  
        while(cond) {  
            Body;  
        }  
    }  
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unwind one
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Loop unwinding

```
void f(...) {  
    ...  
    if(cond) {  
        Body;  
    }  
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        Body;  
    }  
    if(cond) {  
        Body;  
        while(cond) {  
            Body;  
        }  
    }  
    }  
    }  
    }  
    Remainder;  
}
```

unwind one

unwind one

unwind one
iteration...

Loop unwinding

```
void f(...) {  
  ...  
  if(cond) {  
    Body;  
    if(cond) {  
      Body;  
      if(cond) {  
        Body;  
        assert(!cond);  
      }  
    }  
  }  
  Remainder;  
}
```

unwind one

unwind one

unwind one
iteration...

unwinding
assertion

- unwinding assertion
 - inserted after last unwound iteration
 - violated if program runs longer than bound permits
- ⇒ if not violated: (real) correctness result!

Loop unwinding

```
void f(...) {  
    ...  
    for(i=0; i<N; i++) {  
        ...  
        b[i]=a[i];  
        ...  
    };  
    ...  
    for(i=0; i<N; i++) {  
        ...  
        assert(b[i]-a[i]>0);  
        ...  
    };  
    ...  
    Remainder;  
}
```

- unwinding assertion
 - inserted after last unwound iteration
 - violated if program runs longer than bound permits
 - ⇒ if not violated: (real) correctness result!
- ⇒ what about multiple loops?
- use --partial-loops to suppress insertion
 - ⇒ unsound

Safety conditions

- Built-in safety checks converted into explicit assertions:

e.g., array safety:

```
a[i]=...;
```

```
⇒ assert(0 <= i && i < N); a[i]=...;
```

Safety conditions

- Built-in safety checks converted into explicit assertions:

e.g., array safety:

```
a[i]=...;
```

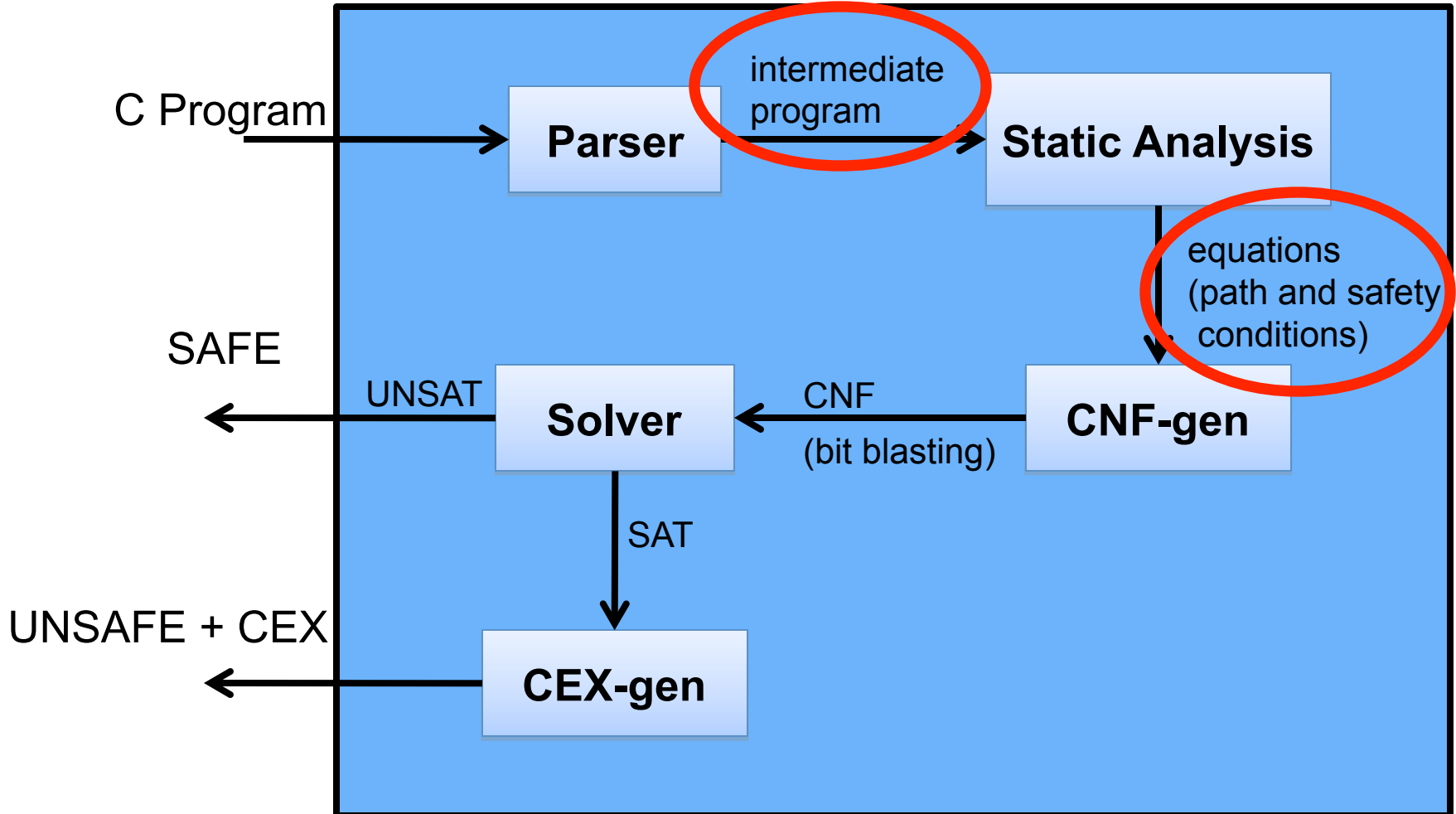
```
⇒ assert(0 <= i && i <= N); a[i]=...;
```

⇒ sometimes easier at intermediate representation or formula level

e.g., word-aligned pointer access, overflow, ...

SAT/SMT-based BMC tools for C

High-level architecture:



Transforming straight-line programs into equations

- simple if each variable is assigned only once:

```
x = a;  
y = x + 1;  
z = y - 1;
```

program



```
x = a      &&  
y = x + 1  &&  
z = y - 1
```

constraints

- still simple if variables are assigned multiple times:

```
x = a;  
x = x + 1;  
x = x - 1;
```

program



```
x0 = a;  
x1 = x0 + 1;  
x2 = x1 - 1;
```

program in SSA-form

introduce fresh copy for each occurrence
(*static single assignment (SSA) form*)

Transforming loop-free programs into equations

But what about control flow branches (if-statements)?

```
if(v)
  x = y;
else
  x = z;

w = x;
```



```
if(v0)
  x0 = y0;
else
  x1 = z0;

w1 = ?
```

introduce & use
new variable

- for each control flow join point, add a new variable with guarded assignment as definition
 - also called ϕ -function

Transforming loop-free programs into equations

But what about control flow branches (if-statements)?

```
if(v)
  x = y;
else
  x = z;

w = x;
```



```
if(v0)
  x0 = y0;
else
  x1 = z0;
x2 = v0 ? x0 : x1;
w1 = x2;
```

introduce & use
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- for each control flow join point, add a new variable with guarded assignment as definition
 - also called ϕ -function

Bit-blasting

Conversion of equations into SAT problem:

- simple assignments:

$$|[x = y]| \hat{=} \bigwedge_i x_i \Leftrightarrow y_i$$



effective
bitwidth

⇒ static analysis must approximate effective bitwidth well

- ϕ -functions:

$$|[x = v ? y : z]| \hat{=} (v \Rightarrow |[x = y]|) \wedge (\neg v \Rightarrow |[x = z]|)$$

- Boolean operations:

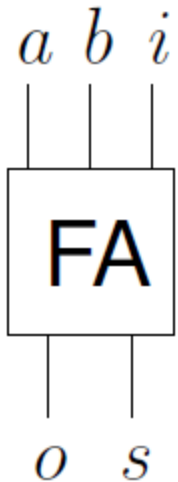
$$|[x = y | z]| \hat{=} \bigwedge_i x_i \Leftrightarrow (y_i \vee z_i)$$

Exercise: relational operations

Bit-blasting arithmetic operations

Build **circuits** that implement the operations!

1-bit addition:



Full Adder

$$s \equiv (a + b + i) \bmod 2 \equiv a \oplus b \oplus i$$

$$o \equiv (a + b + i) \operatorname{div} 2 \equiv a \cdot b + a \cdot i + b \cdot i$$

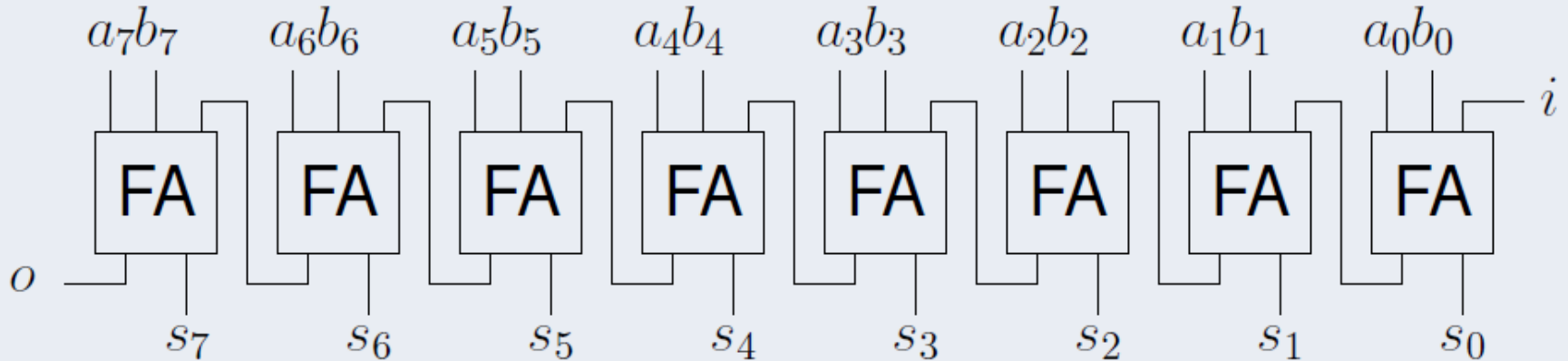
Full adder as CNF:

$$(a \vee b \vee \neg o) \wedge (a \vee \neg b \vee i \vee \neg o) \wedge (a \vee \neg b \vee \neg i \vee o) \wedge$$
$$(\neg a \vee b \vee i \vee \neg o) \wedge (\neg a \vee b \vee \neg i \vee o) \wedge (\neg a \vee \neg b \vee o)$$

Bit-blasting arithmetic operations

Build **circuits** that implement the operations!

8-Bit ripple carry adder (RCA)



⇒ adds w variables, $6 \cdot w$ clauses

⇒ multiplication / division much more complicated

Handling arrays

Arrays can be replaced by individual variables, with a “demux” at each access:

```
int a[10];  
...  
x = a[i];
```



```
int a0, a1, a2, ... a9;  
...  
x = (i==0 ? a0  
      : (i==1 ? a1  
          : (i==2 ? a2  
                : ...));
```

⇒ surprisingly effective (for $N < 1000$) because value of i can often be determined statically

- due to constant propagation

Handling arrays with theories

Arrays can be seen as ADT with two operations:

- read: Array x Index \rightarrow Element *“select”*
- write: Array x Index x Element *“update”*

```
...  
a[i]=a[i]+1;  
...
```



```
...  
a1=write(a0, i, read(a0, i)+1);  
...
```

Handling arrays with theories

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...  
a[i]=a[i]+1;  
...
```



```
...  
a1=write(a0, i, read(a0, i)+1);  
...
```

Axioms describe intended semantics:

a write modifies the position written to ...

$$p = r \implies \text{read}(\text{write}(a, p, v), r) = v$$

$$\neg(p = r) \implies \text{read}(\text{write}(a, p, v), r) = \text{read}(a, r)$$

...and nothing else

\Rightarrow requires support by **SMT-solver**

Handling arrays with λ -terms

How to handle `memset` and `memcpy`?

```
void *memset(void *dst, int c, size_t n);
```

```
void *memcpy(void *dst, const void *src, size_t n);
```

Handling arrays with λ -terms

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```
void *memcpy(void *dst, const void *src, size_t n);
```

```
...  
memcpy(a, b, 4);  
...
```



```
...  
a1=write(a0, 0, read(b, 0));  
a2=write(a1, 1, read(b, 1));  
a3=write(a2, 2, read(b, 2));  
a4=write(a3, 3, read(b, 3));  
...
```

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```

```
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a1=write(a0, 0, read(b, 0));  
a2=write(a1, 1, read(b, 1));  
a3=write(a2, 2, read(b, 2));  
a4=write(a3, 3, read(b, 3));  
...
```

- not scalable for large constants
- need to encode as loop for non-constant block sizes
 - same problems for normal array-copy operations

Handling arrays with λ -terms

How to handle `memset` and `memcpy`?

```
void *memset(void *dst, int c, size_t n);
```

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void *memcpy(void *dst, const void *src, size_t n);
```

Abuse of notation

```
...  
memcpy(a, b, 4);  
...
```



```
...  
a1 =  $\lambda i. (0 \leq i \ \&\& \ i < 4) ?$   
        read(b, i) : read(a0, i));  
...
```

- similar for `memset` and array-copy loops
- additional axiom describes intended semantics

$$\curvearrowright \text{read}(\lambda i. s, r) = s[i/r]$$

β -reduction

\Rightarrow requires integration into **SMT-solver**

Lambdas, Arrays and Quantifiers

- **Parallel updates**

Update n elements of array a with value c starting from index i , which yields a new array b , e.g.,

$$b = \text{memset}(a, i, n, c)$$
$$\forall x. (\text{read}(b, x) = \text{ite}(i \leq x < i + n, c, \text{read}(a, x)))$$
$$\lambda x. \text{ite}(i \leq x < i + n, c, \text{read}(a, x))$$

- **Copy operations**

Copy n elements of array a starting from index i to array b at index j , which yields a new array b' , e.g.,

$$b' = \text{memcpy}(a, b, i, j, n)$$
$$\forall x. (\text{read}(b', x) = \text{ite}(j \leq x < j + n, \text{read}(a, i + x - j), \text{read}(b, x)))$$
$$\lambda x. \text{ite}(j \leq x < j + n, \text{read}(a, i + x - j), \text{read}(b, x))$$

Mathias Preiner, Aina Niemetz, Armin Biere: Better Lemmas with Lambda Extraction. FMCAD 2015: 128-135

Handling arrays with λ -terms

```
int i, j, n = ...;
int *a = malloc(2 * n * sizeof(int));
for (i = 0; i < n; ++i) {
    a[i] = i + 1;
}
for (j = n; j < 2 * n; ++j) {
    a[j] = 2 * j;
}
```

$$a' = \lambda i. \text{ITE}(0 \leq i < n, i + 1, \text{read}(a, i))$$
$$a'' = \lambda j. \text{ITE}(n \leq j < 2 * n, 2 * j, \text{read}(a', j))$$

SAT vs. SMT

BMC tools use both **propositional satisfiability** (SAT) and **satisfiability modulo theories** (SMT) solvers:

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- SAT solvers require encoding everything in CNF
 - limited support for high-level operations
 - easier to reflect machine-level semantics
 - can be extremely efficient (SMT falls back to SAT)

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- SAT solvers require encoding everything in CNF
 - limited support for high-level operations
 - easier to reflect machine-level semantics
 - can be extremely efficient (SMT falls back to SAT)
- SMT solvers support built-in theories
 - equality, free function symbols, arithmetics, arrays,...
 - sometimes even quantifiers
 - very flexible, extensible, front-end easier
 - requires extra effort to enforce precise semantics
 - can be slower

Modeling with non-determinism

Extend C with three modeling features:

- **assert(e)**: aborts execution when e is false, no-op otherwise

```
void assert (_Bool b) { if (!b) exit(); }
```

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void assert (_Bool b) { if (!b) exit(); }
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- **nondet_int()**: returns non-deterministic int-value

```
int nondet_int () { int x; return x; }
```

Modeling with non-determinism

Extend C with three modeling features:

- **assert(e)**: aborts execution when e is false, no-op otherwise

```
void assert (_Bool b) { if (!b) exit(); }
```

- **nondet_int()**: returns non-deterministic int-value

```
int nondet_int () { int x; return x; }
```

- **assume(e)**: “ignores” execution when e is false, no-op otherwise

```
void assume (_Bool e) { while (!e) ; }
```

Modeling with non-determinism

General approach:

- use C program to set up structure and deterministic computations
- use non-determinism to set up search space
- use assumptions to constrain search space
- use failing assertion to start search

```
int main() {
    int x=nondet_int(),y=nondet_int(),z=nondet_int();
    __ESBMC_assume(x > 0 && y > 0 && z > 0);
    __ESBMC_assume(x < 16384 && y < 16384 && z < 16384);
    assert(x*x + y*y != z*z);
    return 0;
}
```

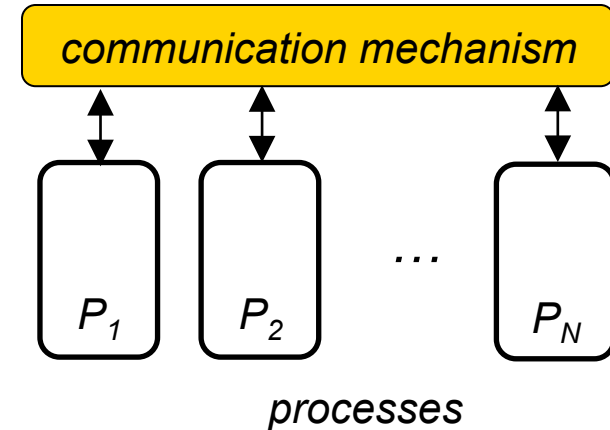
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Concurrency verification

Writing concurrent programs is DIFFICULT

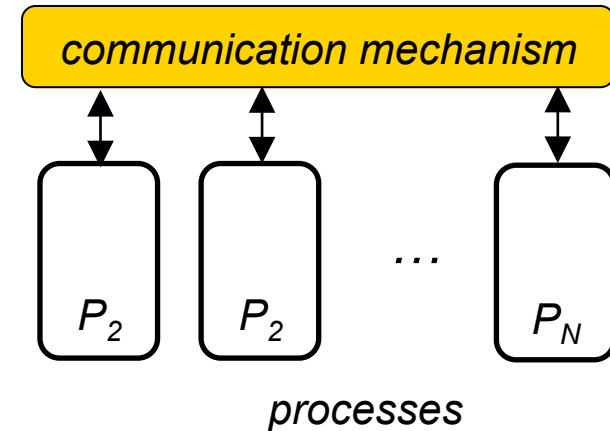
- programmers have to guarantee
 - correctness of sequential execution of each individual process
 - with nondeterministic interferences from other processes (schedules)



Concurrency verification

Writing concurrent programs is DIFFICULT

- programmers have to guarantee
 - correctness of sequential execution of each individual process
 - with nondeterministic interferences from other processes (schedules)
 - rare schedules result in errors that are difficult to find, reproduce, and repair
 - testers can spend weeks chasing a single bug
- ⇒ ***huge productivity problem***



Concurrency verification

What happens here...???

```
int n=0; //shared variable

void* P(void* arg) {
    int tmp, i=1;
    while (i<=10) {
        tmp = n;
        n = tmp + 1;
        i++;
    }
    return NULL;
}

int main (void) {
    pthread_t id1, id2;
    pthread_create(&id1, NULL, P, NULL);
    pthread_create(&id2, NULL, P, NULL);
    pthread_join(id1, NULL);
    pthread_join(id2, NULL);
    assert(n == 20);
}
```

Which values can n actually have?

Concurrency verification

What happens here...???

```
int n=0; //shared variable

void* P(void* arg) {
    int tmp, i=1;
    while (i<=10) {
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    pthread_join(id1, NULL);
    pthread_join(id2, NULL);
    assert(n == 20);
}
```

```
$gcc example-2.c -o
example-2
$./example-2
$./example-2
$./example-2
$./example-2
$./example-2
$./example-2
Assertion failed: (n
== 20), function main,
file example-2.c, line
22.
```

Which values can n actually have?

Concurrency verification

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        n = tmp + 1;
        i++;
    }
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}

int main (void) {
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    pthread_create(&id1, NULL, P, NULL);
    pthread_create(&id2, NULL, P, NULL);
    pthread_join(id1, NULL);
    pthread_join(id2, NULL);
    assert(n >= 10 && n <= 20);
}
```

Concurrency verification

What happens here...???

```
int n=0; //shared variable
pthread_mutex_t mutex;
void* P(void* arg) {
    int tmp, i=1;
    while (i<=10) {
        pthread_mutex_lock(&mutex);
        tmp = n;
        n = tmp + 1;
        pthread_mutex_unlock(&mutex);
        i++;
    }
    return NULL;
}
int main (void) {
    pthread_t id1, id2;
    pthread_mutex_init(&mutex, NULL);
    pthread_create(&id1, NULL, P, NULL);
    pthread_create(&id2, NULL, P, NULL);
    pthread_join(id1, NULL);
    pthread_join(id2, NULL);
    assert(n == 20);
}
```

Concurrency errors

There are two main kinds of concurrency errors:

- **progress** errors: deadlock, starvation, ...
 - typically caused by wrong **synchronization**
 - requires modeling of synchronization primitives
 - mutex locking / unlocking
 - requires modeling of (global) error condition

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- **progress** errors: deadlock, starvation, ...
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 - typically caused by **data races** (i.e., unsynchronized access to shared data)
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 - can be checked locally

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- **safety** errors: assertion violation, ...
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⇒ focus here on safety errors

Shared memory concurrent programs

Concurrent programming styles:

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 - “truly” parallel **distributed** systems
 - multiple computations advancing simultaneously

Shared memory concurrent programs

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 - o active == uncontested access to shared memory
 - o can be single-core or multi-core

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- ⇒ focus here on **multi-threaded, shared memory** programs

Multi-threaded programs

- typical C-implementation: pthreads

Multi-threaded programs

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- formed of individual sequential programs (**threads**)
 - can be created and destroyed on the fly
 - typically for BMC: assume upper bound
 - each possibly with loops and recursive function calls
 - each with **local variables**

Multi-threaded programs

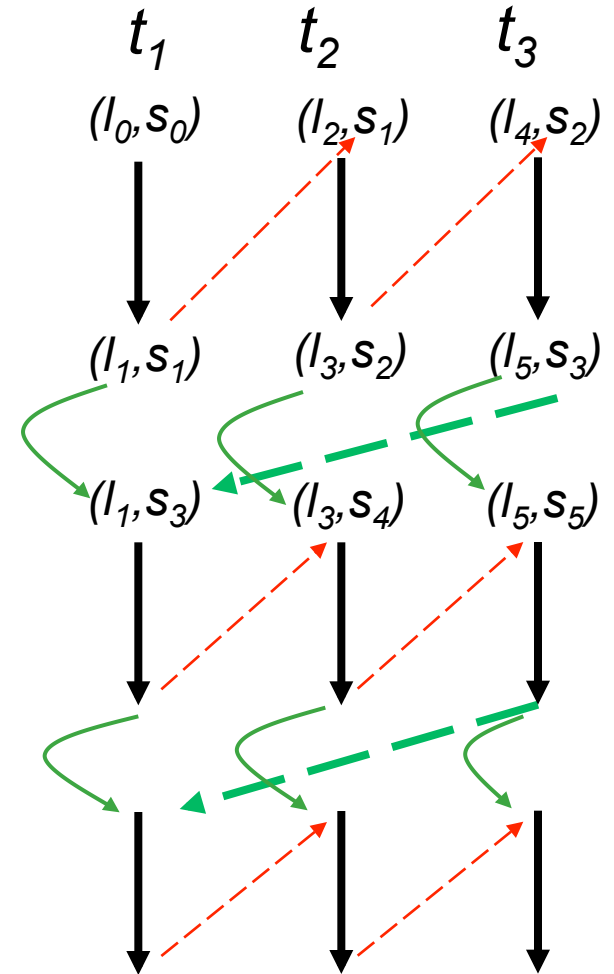
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 - assume **sequential consistency**: writes are immediately visible to all the other programs
 - weak memory models can be modeled
- execution is **interleaving** of thread executions
 - only valid for sequential consistency

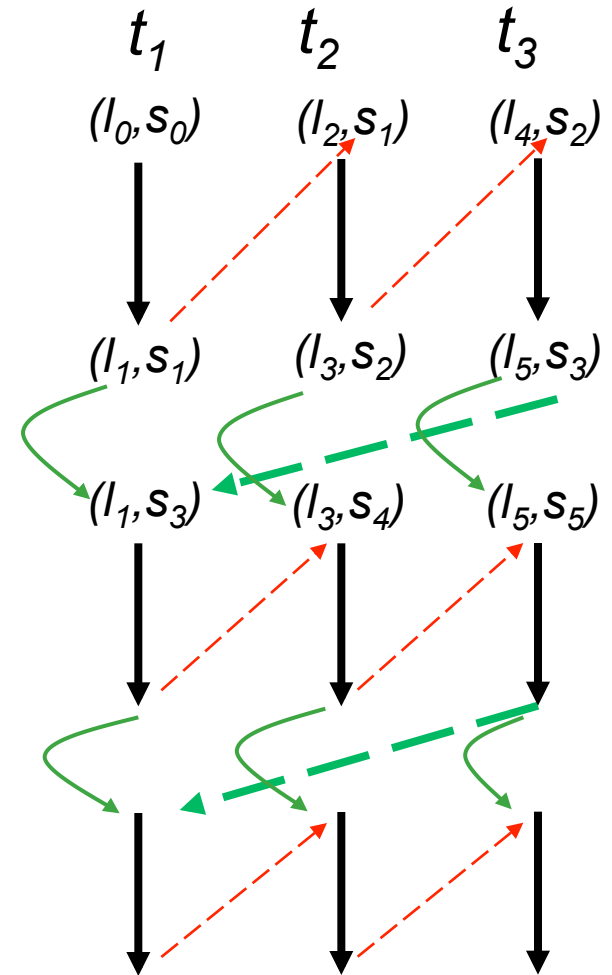
Round-robin scheduling

- **context**: segment of a run of an active thread t_i



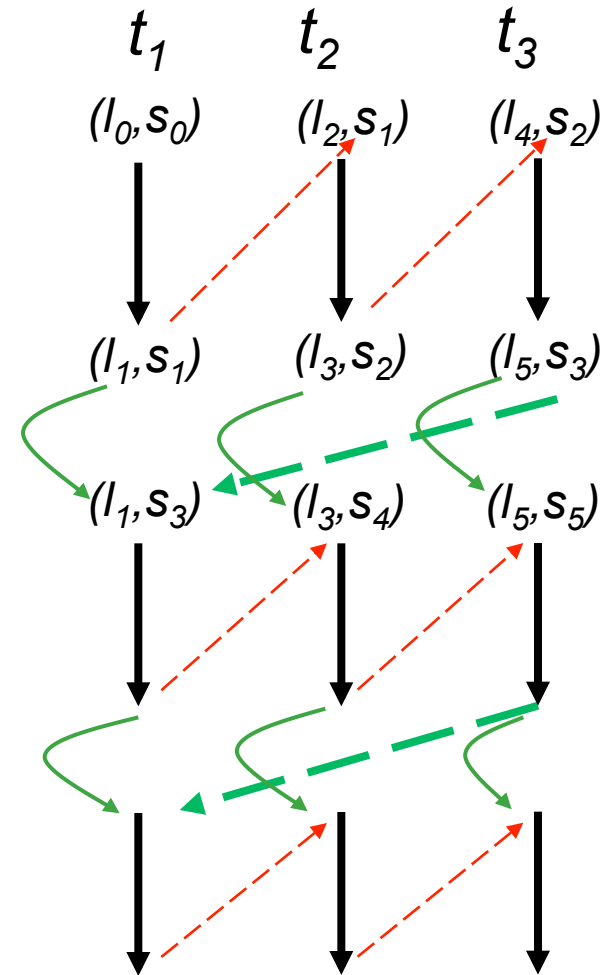
Round-robin scheduling

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 - context switch back to t_i resumes at old **local state** (incl. pc)



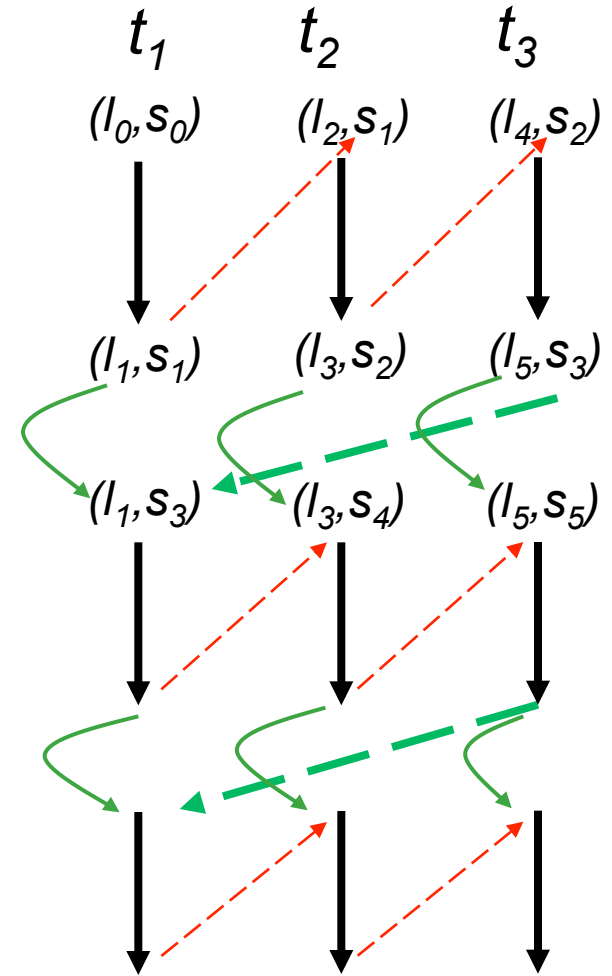
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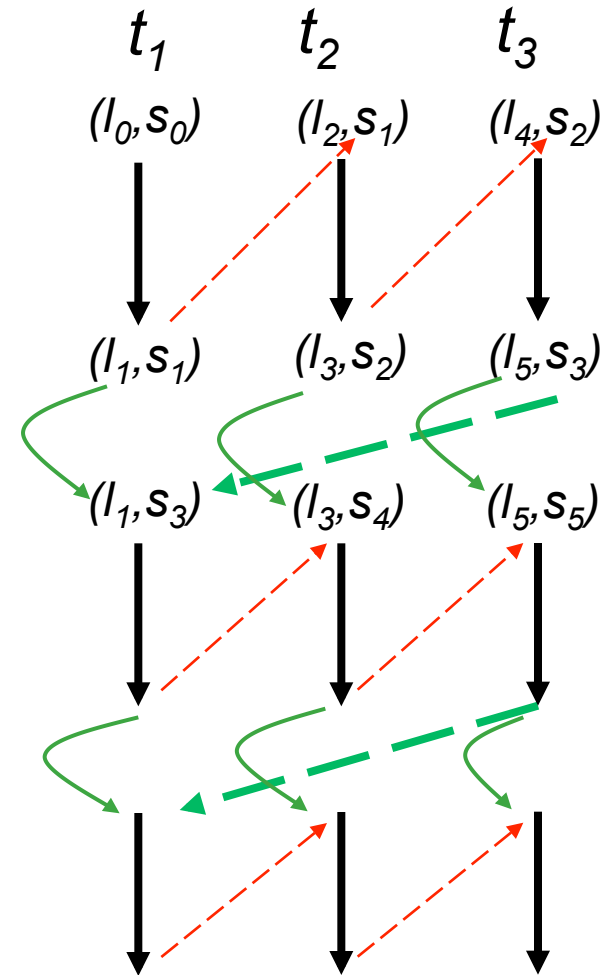
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Round-robin scheduling

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 - context switch back to t_i resumes at old **local state** (incl. pc)
- **round**: formed of one context of each thread
- **round robin schedule**: same order of threads in each round
- can simulate all schedules by round robin schedules



Context-bounded analysis

Important observation:

Most concurrency errors are shallow!

i.e., require only few context switches

⇒ limit the search space by bounding the number of

- context switches
- rounds

Concurrency verification approaches

- Explicit schedule exploration (ESBMC)
 - lazy exploration
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Concurrency verification approaches

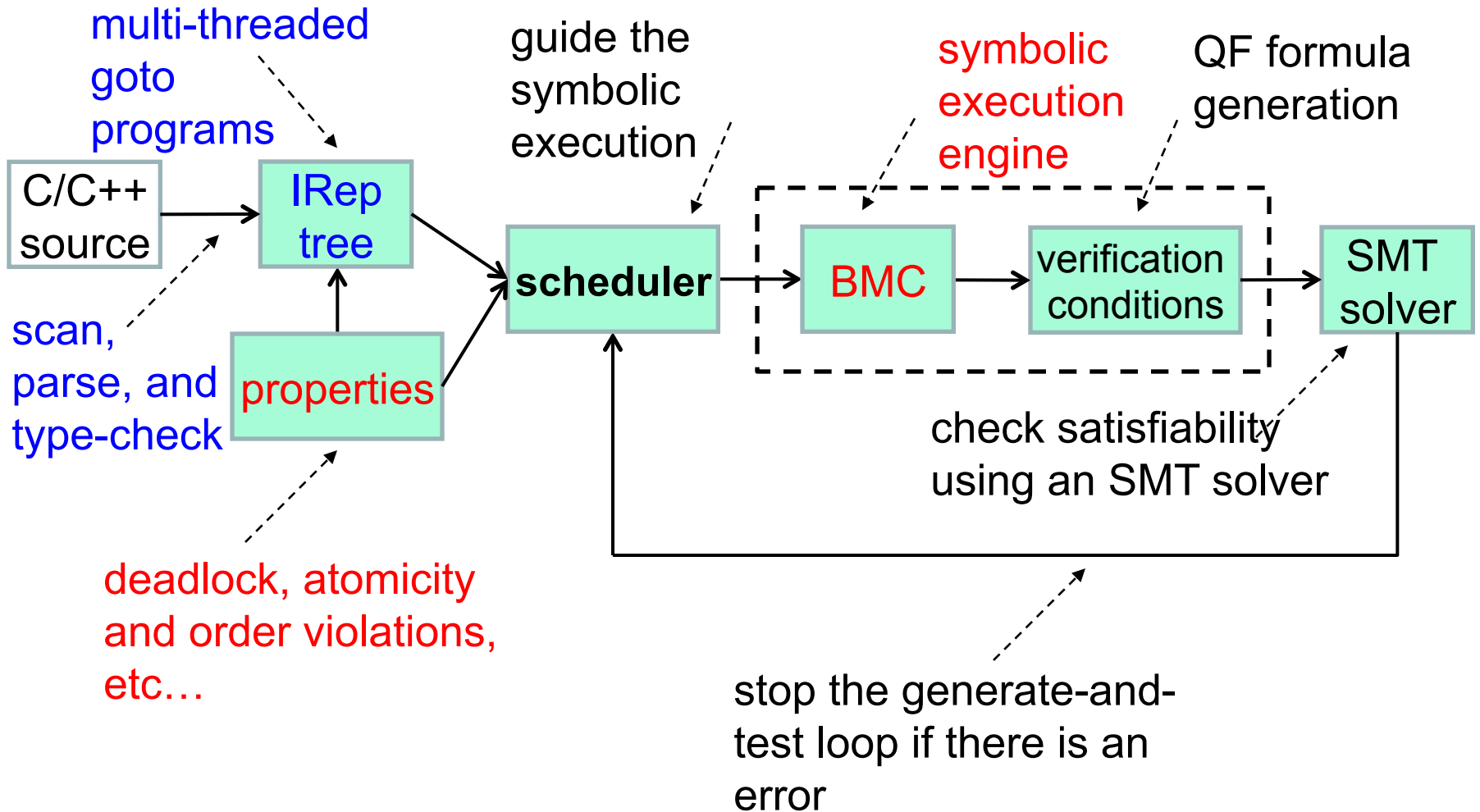
- Explicit schedule exploration (ESBMC)
 - lazy exploration
 - schedule recording
- Partial order methods (CBMC)
- Sequentialization
 - KISS
 - Lal / Reps (eager sequentialization)
 - Lazy CSeq
 - memory unwinding

Intended learning outcomes

- Introduce typical **BMC architectures** for verifying **software systems**
- Understand **communication models** and **typical errors** when writing **concurrent programs**
- Explain **explicit schedule exploration** of multi-threaded software
- Explain **sequentialization methods** to convert concurrent programs into sequential ones

BMC of Multi-threaded Software

Idea: iteratively generate all possible interleavings and call the BMC procedure on each interleaving



Running Example

- the program has sequences of operations that need to be protected together to avoid atomicity violation
 - requirement: the region of code (val1 and val2) should execute atomically

```
Thread twoStage  
1: lock(m1);  
2: val1 = 1;  
3: unlock(m1);  
4: lock(m2);  
5: val2 = val1 + 1;  
6: unlock(m2);
```

```
program counter: 0  
mutexes: m1=0; m2=0;  
global variables: val1=0; val2=0;  
local variables: t1= -1; t2= -1;
```

A state $s \in S$ consists of the value of the program counter pc and the values of all program variables

```
7: unlock(m1);  
8: lock(m2);  
9: t2 = val2;  
10: unlock(m2);  
11: assert(t2==(t1+1));  
12: unlock(m1);  
13: lock(m2);  
14: t2 = val2;  
15: unlock(m2);  
16: assert(t2==(t1+1));
```

Lazy exploration: interleaving I_s

statements:

val1-access:

val2-access:

Thread twoStage

```
1: lock(m1);  
2: val1 = 1;  
3: unlock(m1);  
4: lock(m2);  
5: val2 = val1 + 1;  
6: unlock(m2);
```

Thread reader

```
7: lock(m1);  
8: if (val1 == 0) {  
9:   unlock(m1);  
10:  return NULL; }  
11: t1 = val1;  
12: unlock(m1);  
13: lock(m2);  
14: t2 = val2;  
15: unlock(m2);  
16: assert(t2 == (t1 + 1));
```

program counter: 0

mutexes: m1=0; m2=0;

global variables: val1=0; val2=0;

local variables: t1= -1; t2= -1;

Lazy exploration: interleaving I_s

statements: 1

val1-access:

val2-access:

Thread twoStage

- 1: *lock(m1);*
- 2: *val1 = 1;*
- 3: *unlock(m1);*
- 4: *lock(m2);*
- 5: *val2 = val1 + 1;*
- 6: *unlock(m2);*

Thread reader

```
7: lock(m1);
8: if (val1 == 0) {
9:   unlock(m1);
10:  return NULL; }
11: t1 = val1;
12: unlock(m1);
13: lock(m2);
14: t2 = val2;
15: unlock(m2);
16: assert(t2 == (t1 + 1));
```

program counter: 1

mutexes: m1=1; m2=0;

global variables: val1=0; val2=0;

local variables: t1= -1; t2= -1;

Lazy exploration: interleaving I_s

statements: 1-2

val1-access: $W_{twoStage,2}$

val2-access:

write access to the shared variable *val1* in statement 2 of the thread *twoStage*

```
Thread twoStage
1: lock(m1);
2: val1 = 1;
3: unlock(m1);
4: lock(m2);
5: val2 = val1 + 1;
6: unlock(m2);
```

```
Thread reader
7: lock(m1);
8: if (val1 == 0) {
9:   unlock(m1);
10:  return NULL; }
11: t1 = val1;
12: unlock(m1);
13: lock(m2);
14: t2 = val2;
15: unlock(m2);
16: assert(t2 == (t1 + 1));
```

program counter: 2

mutexes: $m1=1$; $m2=0$;

global variables: **val1=1**; $val2=0$;

local variables: $t1=-1$; $t2=-1$;

Lazy exploration: interleaving I_s

statements: 1-2-3

val1-access: $W_{twoStage,2}$

val2-access:

```
Thread twoStage
1: lock(m1);
2: val1 = 1;
3: unlock(m1);
4: lock(m2);
5: val2 = val1 + 1;
6: unlock(m2);
```

```
Thread reader
7: lock(m1);
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11: t1 = val1;
12: unlock(m1);
13: lock(m2);
14: t2 = val2;
15: unlock(m2);
16: assert(t2 == (t1 + 1));
```

program counter: 3

mutexes: **m1=0**; m2=0;

global variables: val1=1; val2=0;

local variables: t1= -1; t2= -1;

Lazy exploration: interleaving I_s

statements: 1-2-3-7

val1-access: $W_{\text{twoStage},2}$

val2-access:

```
Thread twoStage
1: lock(m1);
2: val1 = 1;
3: unlock(m1);
4: lock(m2);
5: val2 = val1 + 1;
6: unlock(m2);
```

CS1

```
Thread reader
7: lock(m1);
8: if (val1 == 0) {
9:   unlock(m1);
10:  return NULL; }
11: t1 = val1;
12: unlock(m1);
13: lock(m2);
14: t2 = val2;
15: unlock(m2);
16: assert(t2 == (t1 + 1));
```

program counter: 7

mutexes: **m1=1**; m2=0;

global variables: val1=1; val2=0;

local variables: t1= -1; t2= -1;

Lazy exploration: interleaving I

statements: 1-2-3-7-8

val1-access: $W_{\text{twoStage},2} - R_{\text{reader},8}$

val2-access:

read access to the shared variable *val1* in statement 8 of the thread *reader*

```
Thread twoStage
1: lock(m1);
2: val1 = 1;
3: unlock(m1);
4: lock(m2);
5: val2 = val1 + 1;
6: unlock(m2);
```

CS1

```
Thread reader
7: lock(m1);
8: if (val1 == 0) {
9:   unlock(m1);
10:  return NULL; }
11: t1 = val1;
12: unlock(m1);
13: lock(m2);
14: t2 = val2;
15: unlock(m2);
16: assert(t2==(t1+1));
```

program counter: 8

mutexes: $m1=1; m2=0;$

global variables: $val1=1; val2=0;$

local variables: $t1= -1; t2= -1;$

Lazy exploration: interleaving I_s

statements: 1-2-3-7-8-11

val1-access: $W_{twoStage,2}$ - $R_{reader,8}$ - $R_{reader,11}$

val2-access:

```
Thread twoStage
1: lock(m1);
2: val1 = 1;
3: unlock(m1);
4: lock(m2);
5: val2 = val1 + 1;
6: unlock(m2);
```

CS1

```
Thread reader
7: lock(m1);
8: if (val1 == 0) {
9:   unlock(m1);
10:  return NULL; }
11: t1 = val1;
12: unlock(m1);
13: lock(m2);
14: t2 = val2;
15: unlock(m2);
16: assert(t2 == (t1 + 1));
```

program counter: 11

mutexes: $m1=1$; $m2=0$;

global variables: $val1=1$; $val2=0$;

local variables: **$t1=1$** ; $t2=-1$;

Lazy exploration: interleaving I_s

statements: 1-2-3-7-8-11-12

val1-access: $W_{twoStage,2}$ - $R_{reader,8}$ - $R_{reader,11}$

val2-access:

```
Thread twoStage
1: lock(m1);
2: val1 = 1;
3: unlock(m1);
4: lock(m2);
5: val2 = val1 + 1;
6: unlock(m2);
```

CS1

```
Thread reader
7: lock(m1);
8: if (val1 == 0) {
9:   unlock(m1);
10:  return NULL; }
11: t1 = val1;
12: unlock(m1);
13: lock(m2);
14: t2 = val2;
15: unlock(m2);
16: assert(t2 == (t1 + 1));
```

program counter: 12

mutexes: **m1=0**; m2=0;

global variables: val1=1; val2=0;

local variables: t1= 1; t2= -1;

Lazy exploration: interleaving I_s

statements: 1-2-3-7-8-11-12

val1-access: $W_{\text{twoStage},2}$ - $R_{\text{reader},8}$ - $R_{\text{reader},11}$

val2-access:

Thread twoStage

1: lock(m1);

2: val1 = 1;

3: unlock(m1);

4: lock(m2);

5: val2 = val1 + 1;

6: unlock(m2);

CS1

CS2

Thread reader

7: lock(m1);

8: if (val1 == 0) {

9: unlock(m1);

10: return NULL; }

11: t1 = val1;

12: unlock(m1);

13: lock(m2);

14: t2 = val2;

15: unlock(m2);

16: assert(t2 == (t1 + 1));

program counter: 4

mutexes: m1=0; m2=0;

global variables: val1=1; val2=0;

local variables: t1= 1; t2= -1;

Lazy exploration: interleaving I_s

statements: 1-2-3-7-8-11-12-4

val1-access: $W_{twoStage,2}$ - $R_{reader,8}$ - $R_{reader,11}$

val2-access:

Thread twoStage

1: lock(m1);

2: val1 = 1;

3: unlock(m1);

4: lock(m2);

5: val2 = val1 + 1;

6: unlock(m2);

CS1

CS2

Thread reader

7: lock(m1);

8: if (val1 == 0) {

9: unlock(m1);

10: return NULL; }

11: t1 = val1;

12: unlock(m1);

13: lock(m2);

14: t2 = val2;

15: unlock(m2);

16: assert(t2 == (t1 + 1));

program counter: 4

mutexes: m1=0; **m2=1**;

global variables: val1=1; val2=0;

local variables: t1= 1; t2= -1;

Lazy exploration: interleaving I_s

statements: 1-2-3-7-8-11-12-4-5

val1-access: $W_{\text{twoStage},2}$ - $R_{\text{reader},8}$ - $R_{\text{reader},11}$ - $R_{\text{twoStage},5}$

val2-access: $W_{\text{twoStage},5}$

Thread twoStage

1: lock(m1);

2: val1 = 1;

3: unlock(m1);

4: lock(m2);

5: val2 = val1 + 1;

6: unlock(m2);

CS1

CS2

Thread reader

7: lock(m1);

8: if (val1 == 0) {

9: unlock(m1);

10: return NULL; }

11: t1 = val1;

12: unlock(m1);

13: lock(m2);

14: t2 = val2;

15: unlock(m2);

16: assert(t2 == (t1 + 1));

program counter: 5

mutexes: m1=0; m2=1;

global variables: val1=1; **val2=2;**

local variables: t1= 1; t2= -1;

Lazy exploration: interleaving I_s

statements: 1-2-3-7-8-11-12-4-5-6

val1-access: $W_{\text{twoStage},2}$ - $R_{\text{reader},8}$ - $R_{\text{reader},11}$ - $R_{\text{twoStage},5}$

val2-access: $W_{\text{twoStage},5}$

Thread twoStage

1: lock(m1);

2: val1 = 1;

3: unlock(m1);

4: lock(m2);

5: val2 = val1 + 1;

● 6: unlock(m2);

CS1

CS2

Thread reader

7: lock(m1);

8: if (val1 == 0) {

9: unlock(m1);

10: return NULL; }

11: t1 = val1;

12: unlock(m1);

13: lock(m2);

14: t2 = val2;

15: unlock(m2);

16: assert(t2 == (t1 + 1));

program counter: 6

mutexes: m1=0; **m2=0**;

global variables: val1=1; val2=2;

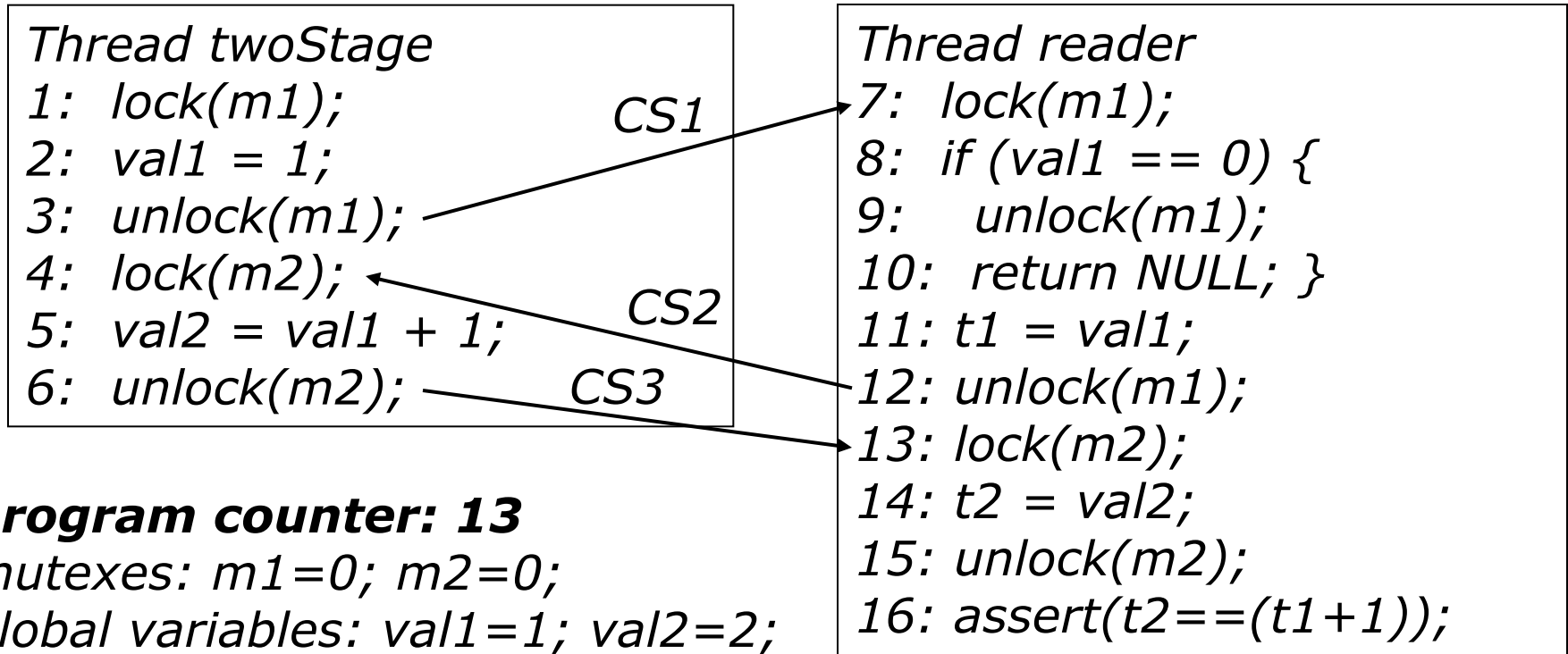
local variables: t1= 1; t2= -1;

Lazy exploration: interleaving I_s

statements: 1-2-3-7-8-11-12-4-5-6

val1-access: $W_{\text{twoStage},2}$ - $R_{\text{reader},8}$ - $R_{\text{reader},11}$ - $R_{\text{twoStage},5}$

val2-access: $W_{\text{twoStage},5}$



program counter: 13

mutexes: $m1=0$; $m2=0$;

global variables: $val1=1$; $val2=2$;

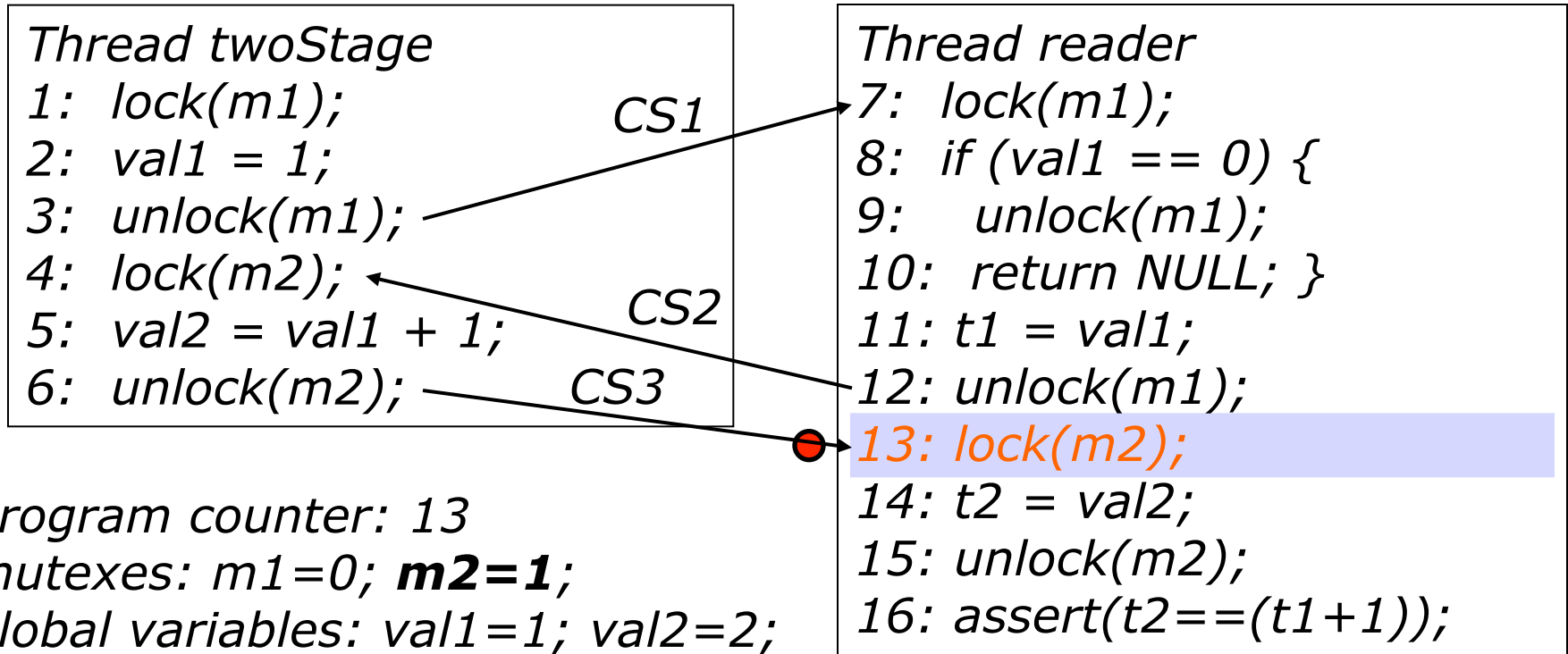
local variables: $t1=1$; $t2=-1$;

Lazy exploration: interleaving I_s

statements: 1-2-3-7-8-11-12-4-5-6-13

val1-access: $W_{\text{twoStage},2}$ - $R_{\text{reader},8}$ - $R_{\text{reader},11}$ - $R_{\text{twoStage},5}$

val2-access: $W_{\text{twoStage},5}$

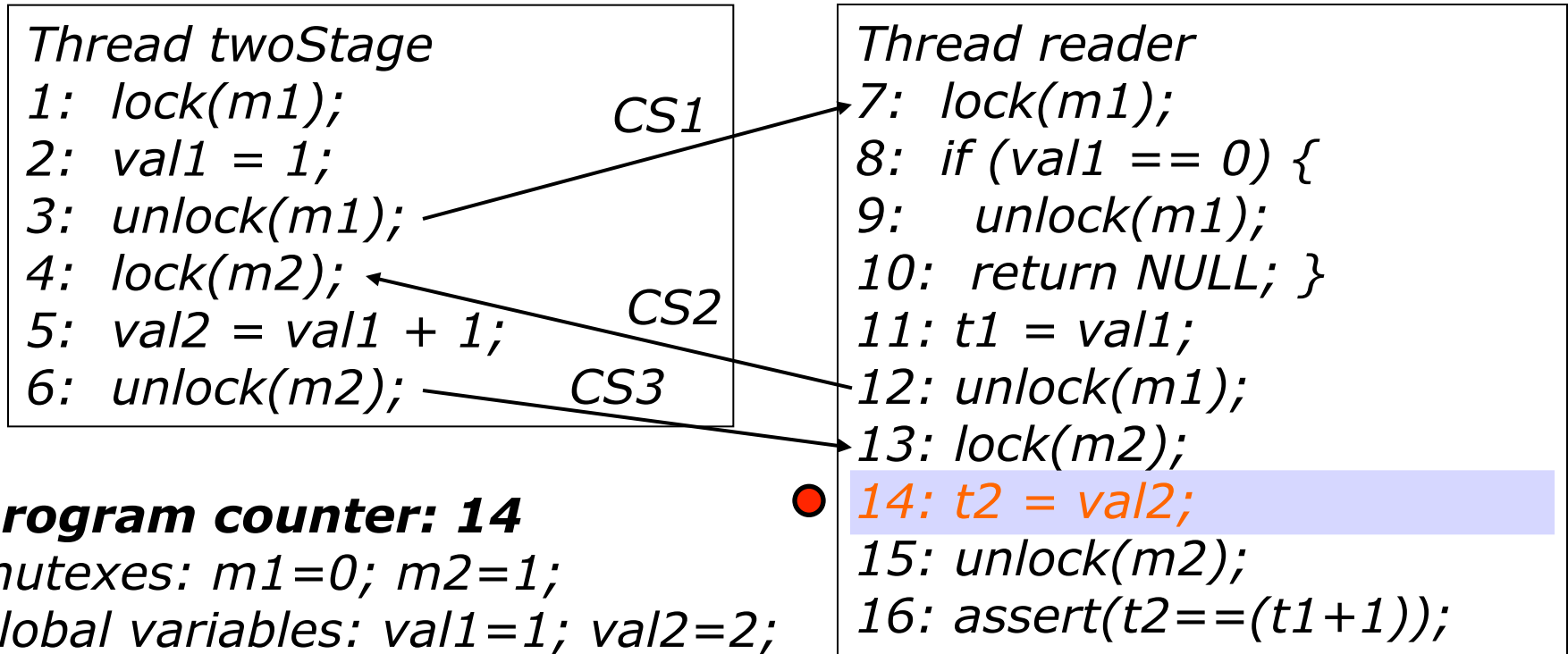


Lazy exploration: interleaving I_s

statements: 1-2-3-7-8-11-12-4-5-6-13-14

val1-access: $W_{twoStage,2}$ - $R_{reader,8}$ - $R_{reader,11}$ - $R_{twoStage,5}$

val2-access: $W_{twoStage,5}$ - $R_{reader,14}$



program counter: 14

mutexes: $m1=0$; $m2=1$;

global variables: $val1=1$; $val2=2$;

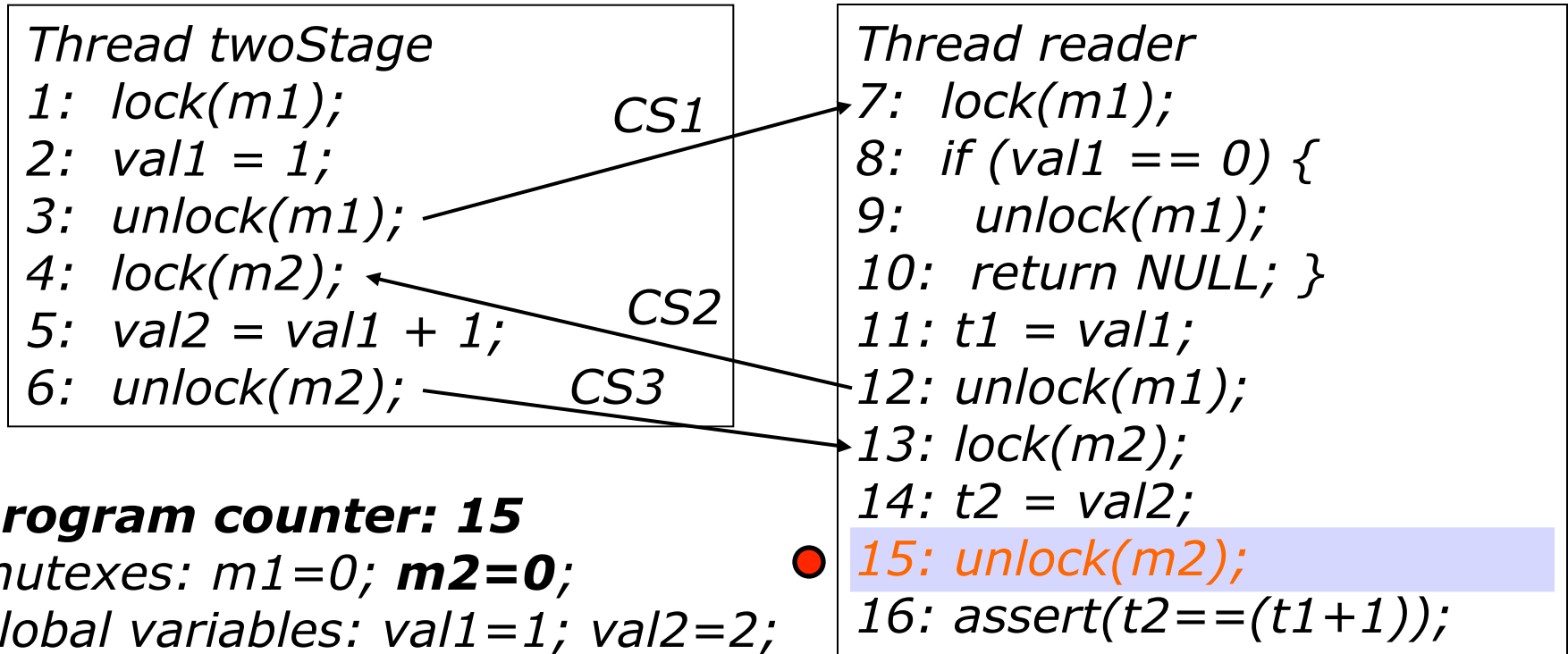
local variables: $t1=1$; **$t2=2$** ;

Lazy exploration: interleaving I_s

statements: 1-2-3-7-8-11-12-4-5-6-13-14-15

val1-access: $W_{twoStage,2}$ - $R_{reader,8}$ - $R_{reader,11}$ - $R_{twoStage,5}$

val2-access: $W_{twoStage,5}$ - $R_{reader,14}$

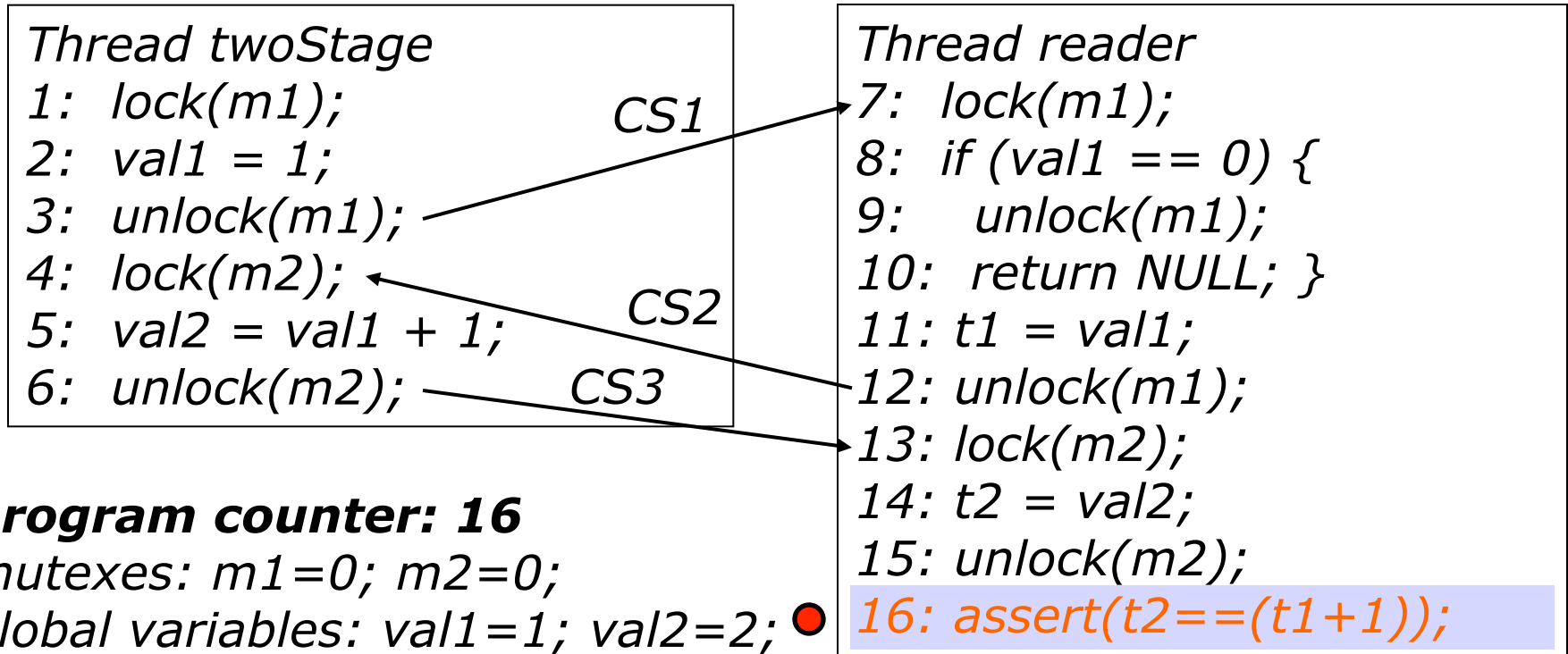


Lazy exploration: interleaving I_s

statements: 1-2-3-7-8-11-12-4-5-6-13-14-15-16

val1-access: $W_{\text{twoStage},2}$ - $R_{\text{reader},8}$ - $R_{\text{reader},11}$ - $R_{\text{twoStage},5}$

val2-access: $W_{\text{twoStage},5}$ - $R_{\text{reader},14}$



program counter: 16

mutexes: $m1=0$; $m2=0$;

global variables: $val1=1$; $val2=2$; ●

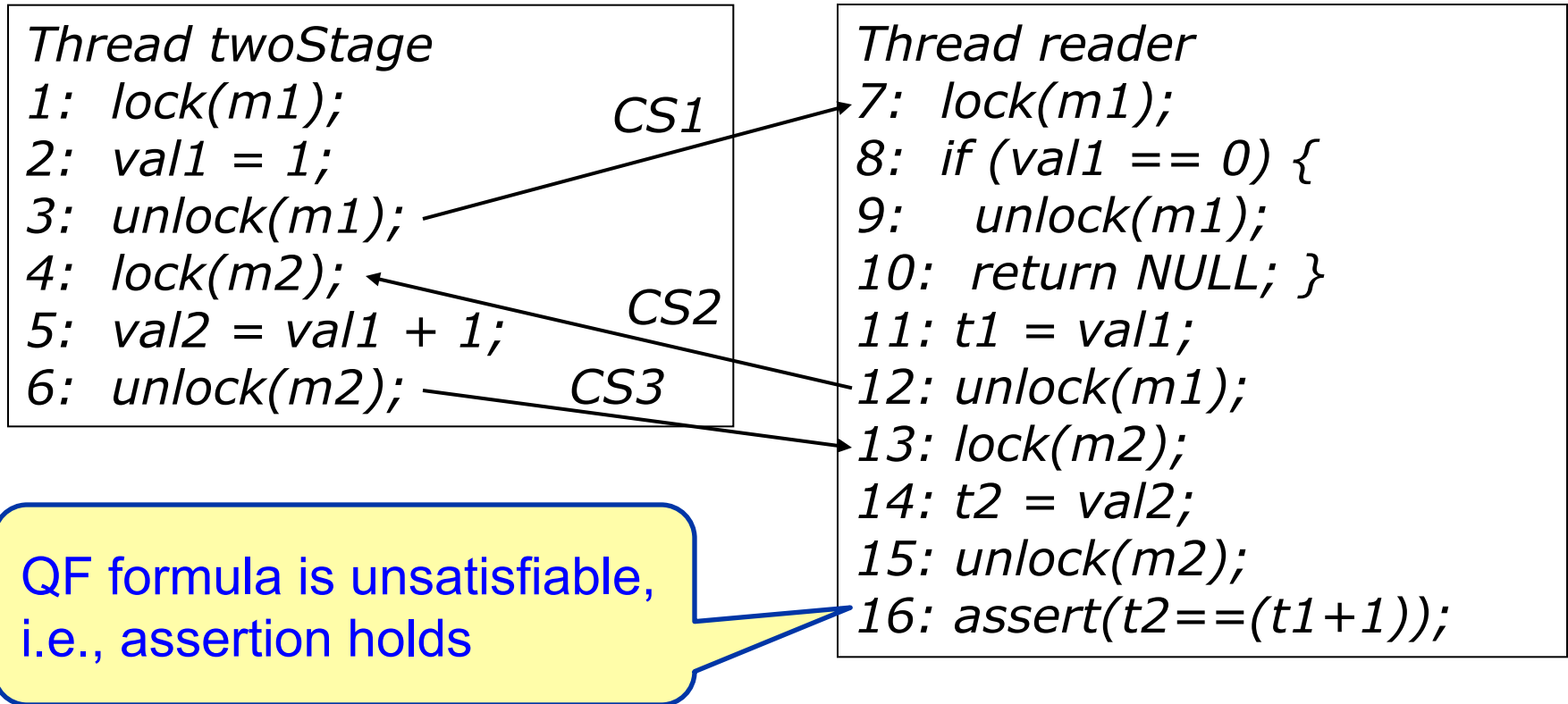
local variables: $t1=1$; $t2=2$;

Lazy exploration: interleaving I_s

statements: 1-2-3-7-8-11-12-4-5-6-13-14-15-16

val1-access: $W_{\text{twoStage},2}$ - $R_{\text{reader},8}$ - $R_{\text{reader},11}$ - $R_{\text{twoStage},5}$

val2-access: $W_{\text{twoStage},5}$ - $R_{\text{reader},14}$



Lazy exploration: interleaving I_f

statements:

val1-access:

val2-access:

Thread twoStage

```
1: lock(m1);  
2: val1 = 1;  
3: unlock(m1);  
4: lock(m2);  
5: val2 = val1 + 1;  
6: unlock(m2);
```

Thread reader

```
7: lock(m1);  
8: if (val1 == 0) {  
9:   unlock(m1);  
10:  return NULL; }  
11: t1 = val1;  
12: unlock(m1);  
13: lock(m2);  
14: t2 = val2;  
15: unlock(m2);  
16: assert(t2 == (t1 + 1));
```

program counter: 0

mutexes: m1=0; m2=0;

global variables: val1=0; val2=0;

local variables: t1= -1; t2= -1;

Lazy exploration: interleaving I_f

statements: 1-2-3

val1-access: $W_{\text{twoStage},2}$

val2-access:

Thread twoStage

```
1: lock(m1);  
2: val1 = 1;  
3: unlock(m1);  
4: lock(m2);  
5: val2 = val1 + 1;  
6: unlock(m2);
```

Thread reader

```
7: lock(m1);  
8: if (val1 == 0) {  
9:   unlock(m1);  
10:  return NULL; }  
11: t1 = val1;  
12: unlock(m1);  
13: lock(m2);  
14: t2 = val2;  
15: unlock(m2);  
16: assert(t2 == (t1 + 1));
```

program counter: 3

mutexes: $m1=0$; $m2=0$;

global variables: **val1=1**; $val2=0$;

local variables: $t1 = -1$; $t2 = -1$;

Lazy exploration: interleaving I_f

statements: 1-2-3

val1-access: $W_{\text{twoStage},2}$

val2-access:

```
Thread twoStage
1: lock(m1);
2: val1 = 1;
3: unlock(m1);
4: lock(m2);
5: val2 = val1 + 1;
6: unlock(m2);
```

CS1

```
Thread reader
7: lock(m1);
8: if (val1 == 0) {
9:   unlock(m1);
10:  return NULL; }
11: t1 = val1;
12: unlock(m1);
13: lock(m2);
14: t2 = val2;
15: unlock(m2);
16: assert(t2 == (t1 + 1));
```

program counter: 7

mutexes: $m1=0$; $m2=0$;

global variables: $val1=1$; $val2=0$;

local variables: $t1 = -1$; $t2 = -1$;

Lazy exploration: interleaving I_f

statements: 1-2-3-7-8-11-12-13-14-15-16

val1-access: $W_{\text{twoStage},2}$ - $R_{\text{reader},8}$ - $R_{\text{reader},11}$

val2-access: $R_{\text{reader},14}$

Thread twoStage

```
1: lock(m1);  
2: val1 = 1;  
3: unlock(m1);  
4: lock(m2);  
5: val2 = val1 + 1;  
6: unlock(m2);
```

CS1

Thread reader

```
7: lock(m1);  
8: if (val1 == 0) {  
9:   unlock(m1);  
10:  return NULL; }  
11: t1 = val1;  
12: unlock(m1);  
13: lock(m2);  
14: t2 = val2;  
15: unlock(m2);  
16: assert(t2 == (t1 + 1));
```

program counter: 16

mutexes: $m1=0$; $m2=0$;

global variables: $val1=1$; $val2=0$;

local variables: **$t1=1$** ; **$t2=0$** ;

Lazy exploration: interleaving I_f

statements: 1-2-3-7-8-11-12-13-14-15-16

val1-access: $W_{twoStage,2}$ - $R_{reader,8}$ - $R_{reader,11}$

val2-access: $R_{reader,14}$

Thread twoStage

```
1: lock(m1);  
2: val1 = 1;  
3: unlock(m1);  
4: lock(m2);  
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6: unlock(m2);
```

CS1

Thread reader

```
7: lock(m1);  
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12: unlock(m1);  
13: lock(m2);  
14: t2 = val2;  
15: unlock(m2);  
16: assert(t2 == (t1 + 1));
```

CS2

program counter: 4

mutexes: $m1=0$; $m2=0$;

global variables: $val1=1$; $val2=0$;

local variables: $t1=1$; $t2=0$;

Lazy exploration: interleaving I_f

statements: 1-2-3-7-8-11-12-13-14-15-16-4-5-6

val1-access: $W_{\text{twoStage},2}$ - $R_{\text{reader},8}$ - $R_{\text{reader},11}$ - $R_{\text{twoStage},5}$

val2-access: $R_{\text{reader},14}$ - $W_{\text{twoStage},5}$

Thread twoStage

1: lock(m1);

2: val1 = 1;

3: unlock(m1);

4: lock(m2);

5: val2 = val1 + 1;

6: unlock(m2);

CS1

Thread reader

7: lock(m1);

8: if (val1 == 0) {

9: unlock(m1);

10: return NULL; }

11: t1 = val1;

12: unlock(m1);

13: lock(m2);

14: t2 = val2;

15: unlock(m2);

16: assert(t2 == (t1 + 1));

CS2

program counter: 6

mutexes: m1=0; m2=0;

global variables: val1=1; **val2=2;**

local variables: t1= 1; t2= 0;

Lazy exploration: interleaving I_f

statements: 1-2-3-7-8-11-12-13-14-15-16-4-5-6

val1-access: $W_{\text{twoStage},2}$ - $R_{\text{reader},8}$ - $R_{\text{reader},11}$ - $R_{\text{twoStage},5}$

val2-access: $R_{\text{reader},14}$ - $W_{\text{twoStage},5}$

Thread twoStage

```
1: lock(m1);
2: val1 = 1;
3: unlock(m1);
4: lock(m2);
5: val2 = val1 + 1;
6: unlock(m2);
```

CS1

Thread reader

```
7: lock(m1);
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12: unlock(m1);
13: lock(m2);
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15: unlock(m2);
16: assert(t2 == (t1 + 1));
```

CS2

QF formula is satisfiable,
i.e., assertion does not hold

Lazy exploration of interleavings

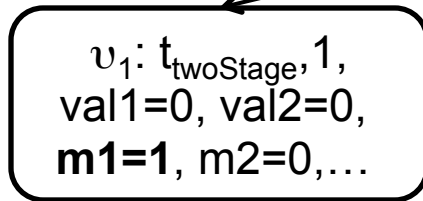
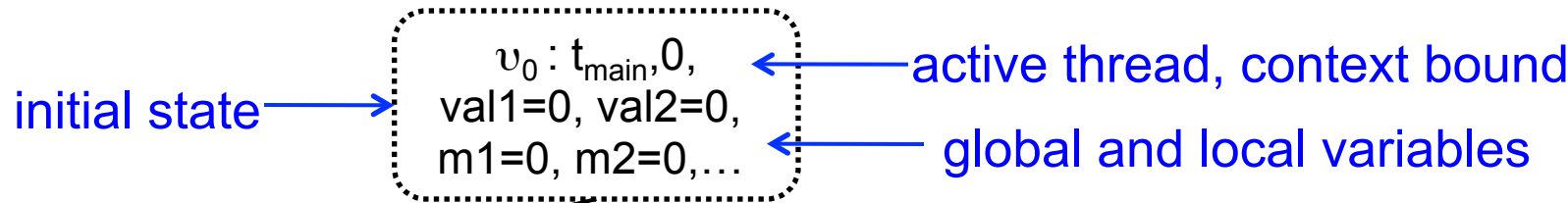
Idea: iteratively generate all possible interleavings and call the BMC procedure on each interleaving

... combines

- **symbolic** model checking: on each individual interleaving
- **explicit state** model checking: explore all interleavings

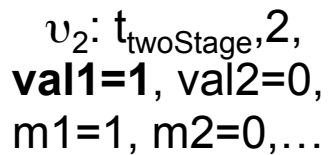
Lazy exploration of interleavings

– Reachability Tree



expansion rules in paper

CS1



interleaving completed, so
call single-threaded BMC

→ execution paths

Lazy exploration of interleavings

– Reachability Tree

initial state

$v_0: t_{\text{main}}, 0,$
 $\text{val1}=0, \text{val2}=0,$
 $m1=0, m2=0, \dots$

← active thread, context bound

← global and local variables

$v_1: t_{\text{twoStage}}, 1,$
 $\text{val1}=0, \text{val2}=0,$
 $m1=1, m2=0, \dots$

backtrack to last unexpanded node and continue

$v_2: t_{\text{twoStage}}, 2,$
 $\text{val1}=1, \text{val2}=0,$
 $m1=1, m2=0, \dots$

$v_3: t_{\text{reader}}, 2,$
 $\text{val1}=0, \text{val2}=0,$
 $m1=1, m2=0, \dots$

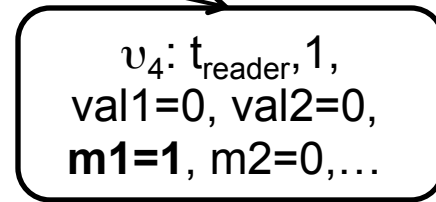
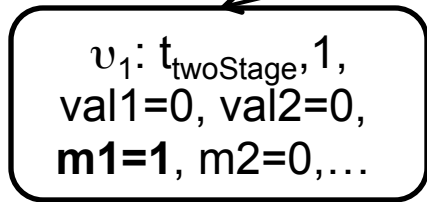
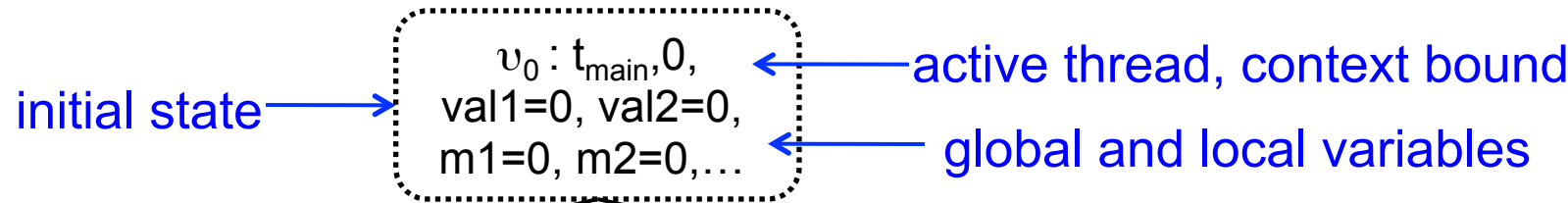
symbolic execution can statically determine that path is blocked (encoded in instrumented mutex-op)

→ execution paths

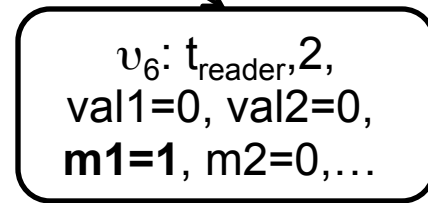
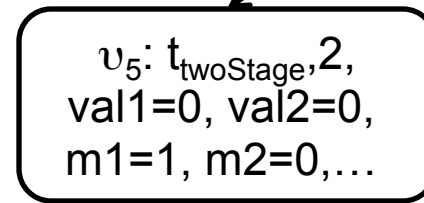
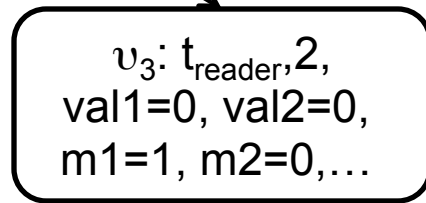
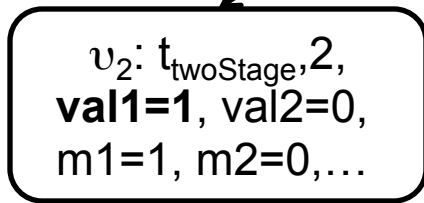
- - - - -> blocked execution paths (eliminated)

Lazy exploration of interleavings

– Reachability Tree



CS1



CS2

→ execution paths

- - - - -> blocked execution paths (eliminated)

Exploring the Reachability Tree

- Use a reachability tree (RT) to describe reachable states of a multi-threaded program

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 - C_i represents the context switch number

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 - A_i represents the currently active thread
 - C_i represents the context switch number
 - s_i represents the current state
 - l_i^j represents the current location of thread j
 - G_i^j represents the control flow guards accumulated in thread j along the path from l_0^j to l_i^j

Expansion Rules of the RT

R1 (assign): If l is an assignment, we execute l , which generates s_{i+1} . We add as child to v a new node v'

$$v' = \left(A_i, C_i, \underline{s_{i+1}}, \left\langle \underline{l_{i+1}^j}, G_i^j \right\rangle \right)_{i+1} \xrightarrow{\quad} l_{i+1}^{A_i} = l_i^{A_i} + 1$$

- we have fully expanded v if
 - l within an atomic block; or
 - l contains no global variable; or
 - the upper bound of context switches ($C_i = C$) is reached
- if v is not fully expanded, for each thread $j \neq A_i$ where G_i^j is enabled in s_{i+1} , we thus create a new child node

$$v'_j = \left(\underline{j}, \underline{C_i + 1}, \underline{s_{i+1}}, \left\langle l_i^j, G_i^j \right\rangle \right)_{i+1}$$

Expansion Rules of the RT

R2 (skip): If l is a *skip*-statement with target l , we increment the location of the current thread and continue with it. We explore no context switches:

$$v' = \left(A_i, C_i, s_i, \left\langle \underline{l_{i+1}^j}, G_i^j \right\rangle \right)_{i+1} \longrightarrow l_{i+1}^j = \begin{cases} l_i^j + 1 & : j = A_i \\ l_i^j & : \textit{otherwise} \end{cases}$$

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R3 (unconditional goto): If l is an unconditional *goto*-statement with target l , we set the location of the current thread and continue with it. We explore no context switches:

$$v' = \left(A_i, C_i, s_i, \left\langle \underline{l_{i+1}^j}, G_i^j \right\rangle \right)_{i+1} \longrightarrow l_{i+1}^j = \begin{cases} l & : j = A_i \\ l_i^j & : \textit{otherwise} \end{cases}$$

Expansion Rules of the RT

R4 (conditional goto): If l is a conditional *goto*-statement with test c and target l , we create two child nodes v' and v'' .

- for v' , we assume that c is *true* and proceed with the target instruction of the jump:

$$v' = \left(A_i, C_i, s_i, \left\langle \underline{l_{i+1}^j}, \underline{c \wedge G_i^j} \right\rangle \right)_{i+1} \xrightarrow{\quad} l_{i+1}^j = \begin{cases} l & : j = A_i \\ l_i^j & : \textit{otherwise} \end{cases}$$

- for v'' , we add $\neg c$ to the guards and continue with the next instruction in the current thread

$$v'' = \left(A_i, C_i, s_i, \left\langle \underline{l_{i+1}^j}, \underline{\neg c \wedge G_i^j} \right\rangle \right)_{i+1} \xrightarrow{\quad} l_{i+1}^j = \begin{cases} l_i^j + 1 & : j = A_i \\ l_i^j & : \textit{otherwise} \end{cases}$$

- prune one of the nodes if the condition is determined statically

Expansion Rules of the RT

R5 (assume): If l is an *assume*-statement with argument c , we proceed similar to R1.

- we continue with the unchanged state s_i but add c to all guards, as described in R4
- If $c \wedge G_i^j$ evaluates to *false*, we prune the execution path

Expansion Rules of the RT

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- we continue with the unchanged state s_i but add c to all guards, as described in R4
- If $c \wedge G_i^j$ evaluates to *false*, we prune the execution path

R6 (assert): If l is an *assert*-statement with argument c , we proceed similar to R1.

- we continue with the unchanged state s_i but add c to all guards, as described in R4
- we generate a verification condition to check the validity of c

Expansion Rules of the RT

R7 (start_thread): If l is a *start_thread* instruction, we add the indicated thread to the set of active threads:

$$v' = \left(A_i, C_i, s_i, \left\langle \underline{l_{i+1}^j}, G_{i+1}^j \right\rangle_{j=1}^{n+1} \right)_{i+1}$$

- where l_{i+1}^{n+1} is the initial location of the thread and $G_{i+1}^{n+1} = G_i^{A_i}$
- the thread starts with the guards of the currently active thread

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- the thread starts with the guards of the currently active thread

R8 (join_thread): If l is a *join_thread* instruction with argument ld , we add a child node:

$$v' = \left(A_i, C_i, s_i, \left\langle \underline{l_{i+1}^j}, G_i^j \right\rangle \right)_{i+1}$$

- where $l_{i+1}^j = l_i^{A_i} + 1$ only if the joining thread ld has exited

Lazy exploration of interleavings

- Main steps of the algorithm:
 1. Initialize the stack with the initial node v_0 and the initial path $\pi_0 = \langle v_0 \rangle$
 2. If the stack is empty, terminate with “no error”.
 3. Pop the current node v and current path π off the stack and compute the set v' of successors of v using rules R1-R8.
 4. If v' is empty, derive the VC φ_k^π for π and call the SMT solver on it. If φ_k^π is satisfiable, terminate with “error”; otherwise, goto step 2.
 5. If v' is not empty, then for each node $v \in v'$, add v to π , and push node and extended path on the stack. goto step 3.

computation path

$$\pi = \{v_1, \dots, v_n\}$$

$$\varphi_k^\pi = \overbrace{I(s_0) \wedge R(s_0, s_1) \wedge \dots \wedge R(s_{k-1}, s_k)}^{\text{constraints}} \wedge \overbrace{\neg \phi_k}^{\text{property}}$$

bound

Observations about the lazy approach

- naïve but useful:
 - bugs usually manifest with few context switches
[Qadeer&Rehof'05]

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 - ▷ *number of executions: $O(n^c)$*
 - as each formula corresponds to one possible path only, its size is relatively small
- can suffer performance degradation:
 - in particular for correct programs where we need to invoke the SMT solver once for each possible execution path

Schedule Recording

Idea: systematically encode all possible interleavings into one formula

- explore reachability tree in same way as lazy approach
- ... but call SMT solver only once
- add a **schedule guard** ts_i for each context switch block i ($0 < ts_i \leq \#threads$)
 - record in which order the scheduler has executed the program
 - SMT solver determines the order in which threads are simulated
- add scheduler guards only to **effective statements** (assignments and assertions)
 - record **effective context switches (ECS)**
 - ECS block: sequence of program statements that are executed with no intervening ECS

Schedule Recording – Interleaving #1

statements:

twoStage-ECS:

reader-ECS:

Thread twoStage

1: lock(m1);

2: val1 = 1;

3: unlock(m1);

4: lock(m2);

5: val2 = val1 + 1;

6: unlock(m2);

ECS block

8: if (val1 == 0) {

9: unlock(m1);

10: return NULL; }

11: t1 = val1;

12: unlock(m1);

13: lock(m2);

14: t2 = val2;

15: unlock(m2);

16: assert(t2==(t1+1));

Schedule Recording – Interleaving #1

statements: 1

twoStage-ECS: (1,1)

reader-ECS:

guarded statement can only be executed if **statement 1** is scheduled in **ECS block 1**

Thread twoStage

```
1: lock(m1);      ts1 == 1
2: val1 = 1;
3: unlock(m1);
4: lock(m2);
5: val2 = val1 + 1;
6: unlock(m2);
```

Thread reader

```
7: lock(m1);
```

each program statement is then prefixed by a schedule guard $ts_i = j$, where:

- i is the **ECS block number**
- j is the **thread identifier**

```
14: t2 = val2;
```

```
15: unlock(m2);
```

```
16: assert(t2==(t1+1));
```


Schedule Recording – Interleaving #1

statements: 1-2

twoStage-ECS: (1,1)-(2,2)

reader-ECS:

Thread twoStage

1: lock(m1); $ts_1 == 1$

2: val1 = 1; $ts_2 == 1$

3: unlock(m1);

4: lock(m2);

5: val2 = val1 + 1;

6: unlock(m2);

Thread reader

7: lock(m1);

8: if (val1 == 0) {

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12: unlock(m1);

13: lock(m2);

14: t2 = val2;

15: unlock(m2);

16: assert(t2==(t1+1));

Schedule Recording – Interleaving #1

statements: 1-2-3

twoStage-ECS: (1,1)-(2,2)-(3,3)

reader-ECS:

Thread twoStage

1: lock(m1); $ts_1 == 1$

2: val1 = 1; $ts_2 == 1$

3: unlock(m1); $ts_3 == 1$

4: lock(m2);

5: val2 = val1 + 1;

6: unlock(m2);

Thread reader

7: lock(m1);

8: if (val1 == 0) {

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10: return NULL; }

11: t1 = val1;

12: unlock(m1);

13: lock(m2);

14: t2 = val2;

15: unlock(m2);

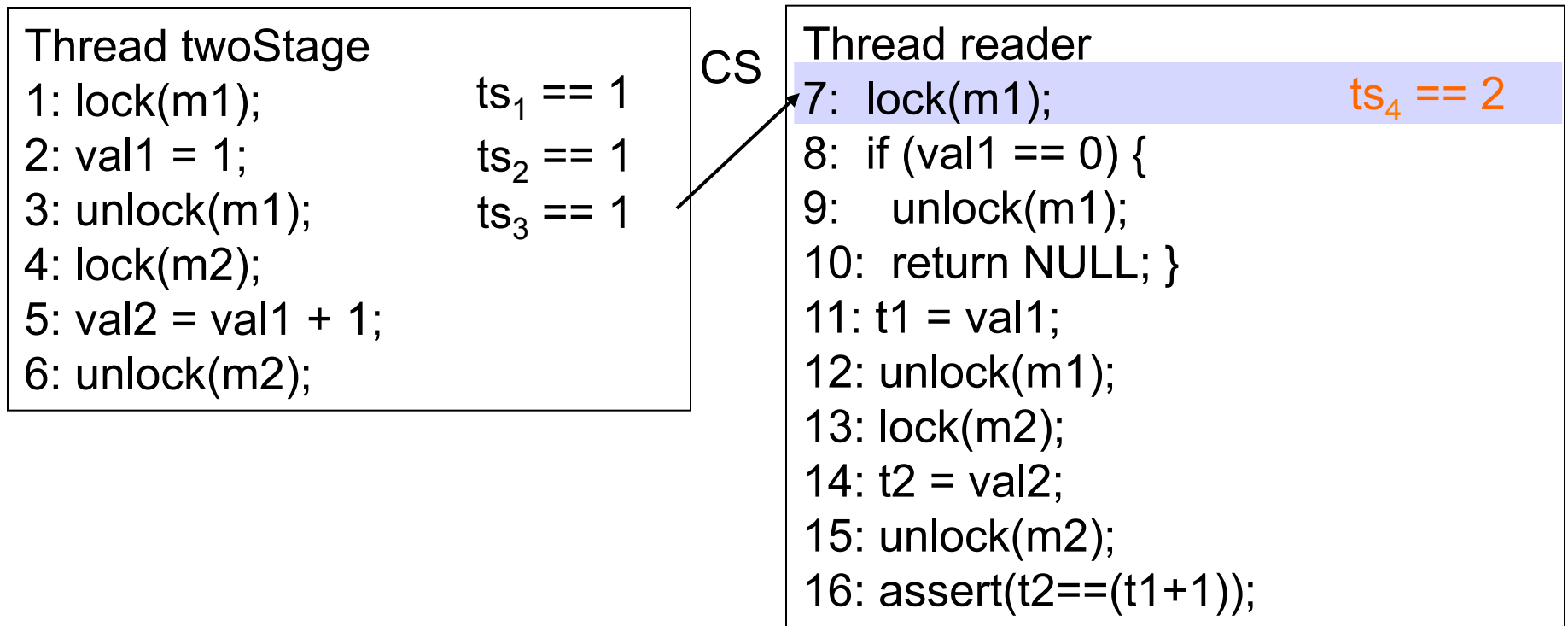
16: assert(t2==(t1+1));

Schedule Recording – Interleaving #1

statements: 1-2-3-7

twoStage-ECS: (1,1)-(2,2)-(3,3)

reader-ECS: (7,4)

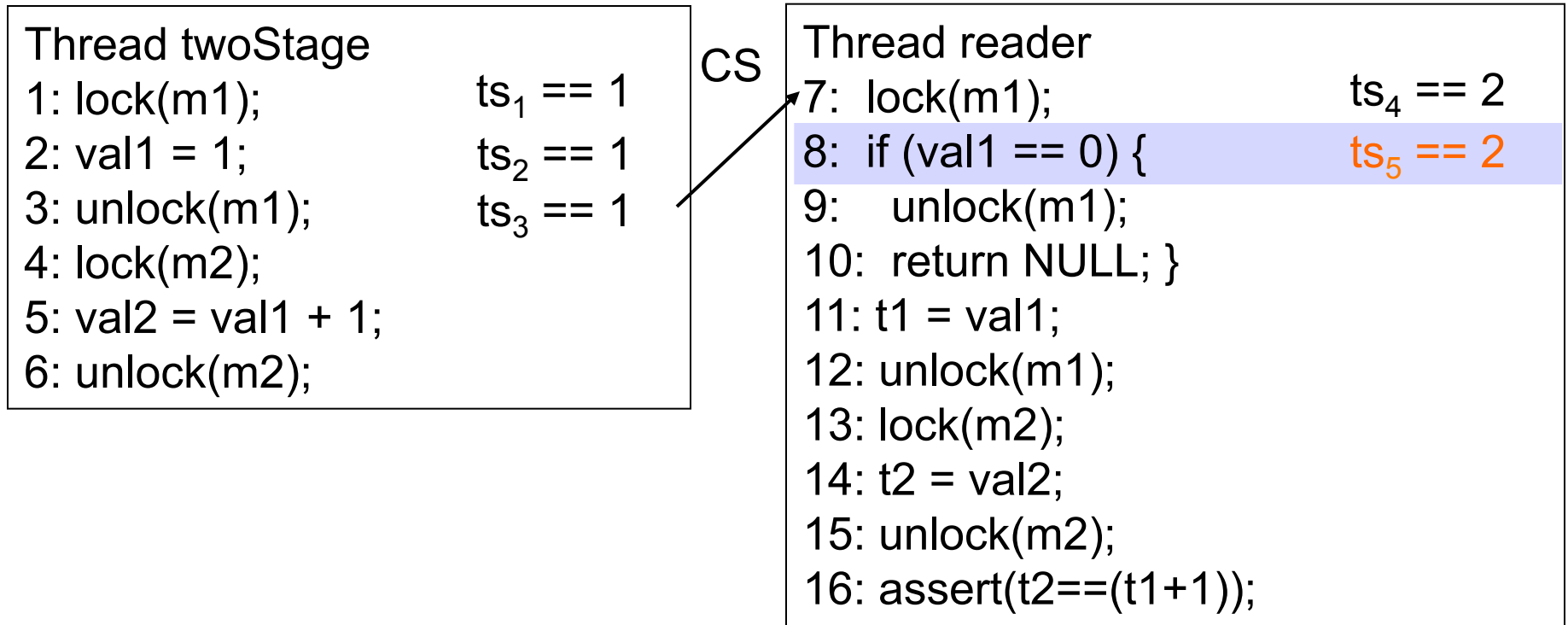


Schedule Recording – Interleaving #1

statements: 1-2-3-7-8

twoStage-ECS: (1,1)-(2,2)-(3,3)

reader-ECS: (7,4)-(8,5)

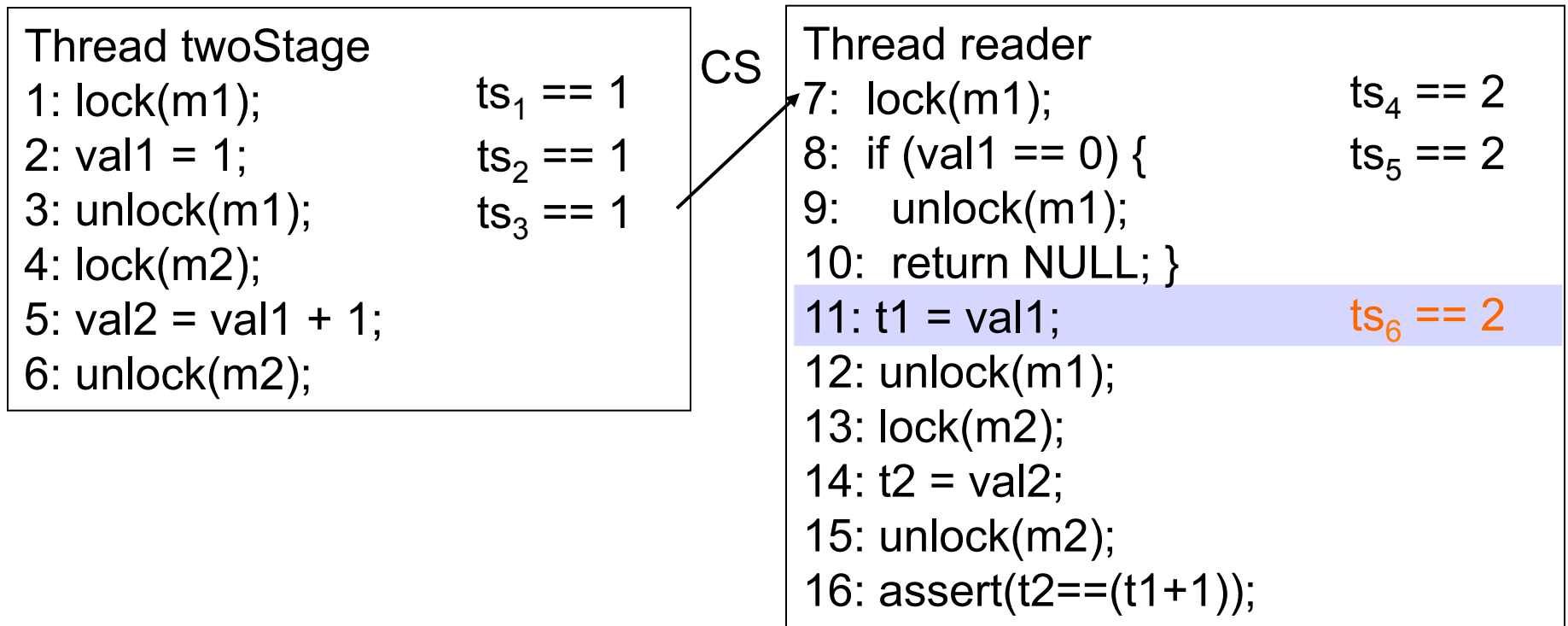


Schedule Recording – Interleaving #1

statements: 1-2-3-7-8-11

twoStage-ECS: (1,1)-(2,2)-(3,3)

reader-ECS: (7,4)-(8,5)-(11,6)

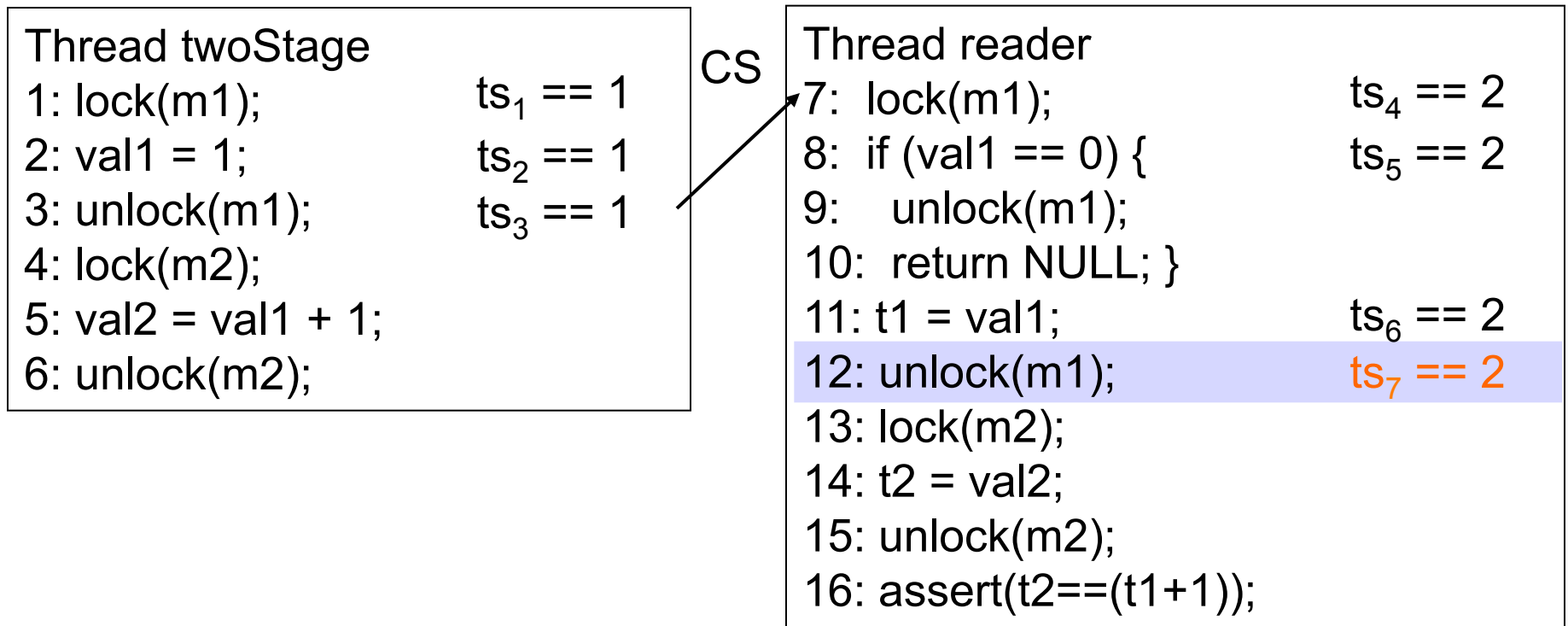


Schedule Recording – Interleaving #1

statements: 1-2-3-7-8-11-12

twoStage-ECS: (1,1)-(2,2)-(3,3)

reader-ECS: (7,4)-(8,5)-(11,6)-(12,7)

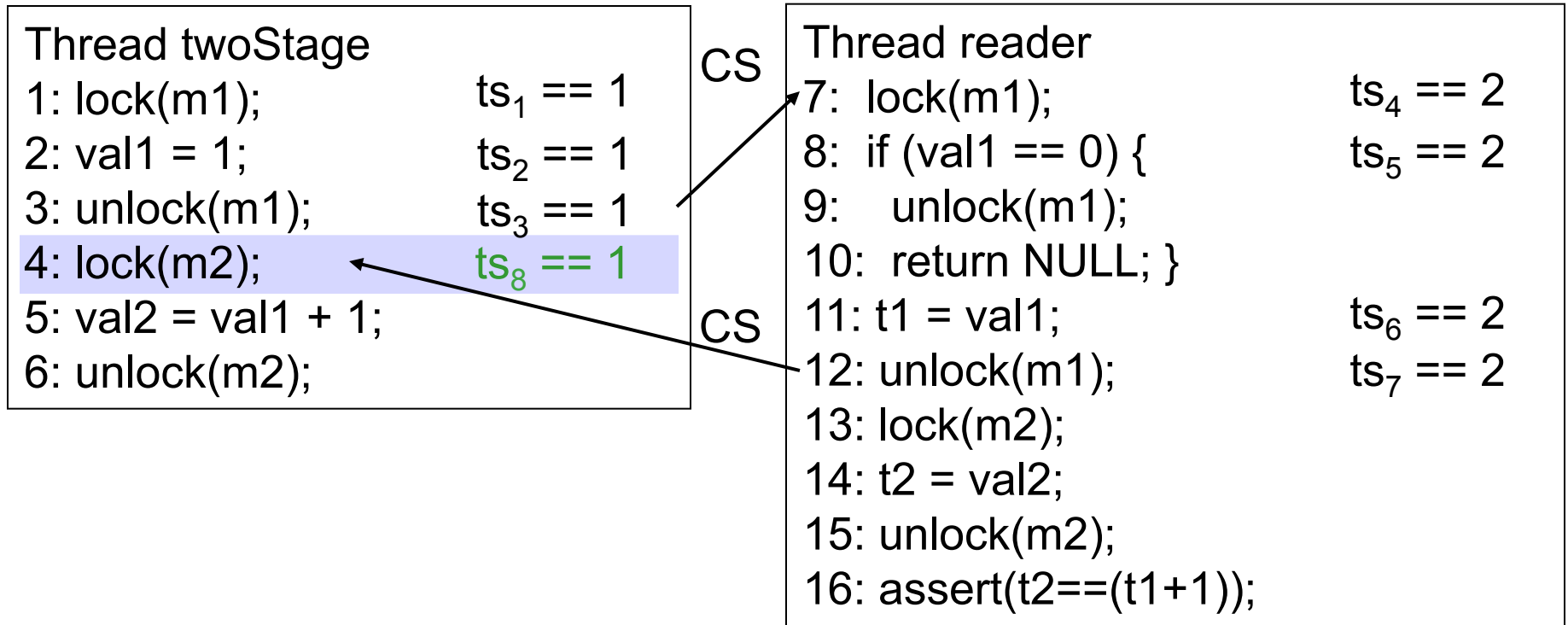


Schedule Recording – Interleaving #1

statements: 1-2-3-7-8-11-12-4

twoStage-ECS: (1,1)-(2,2)-(3,3)-(4,8)

reader-ECS: (7,4)-(8,5)-(11,6)-(12,7)

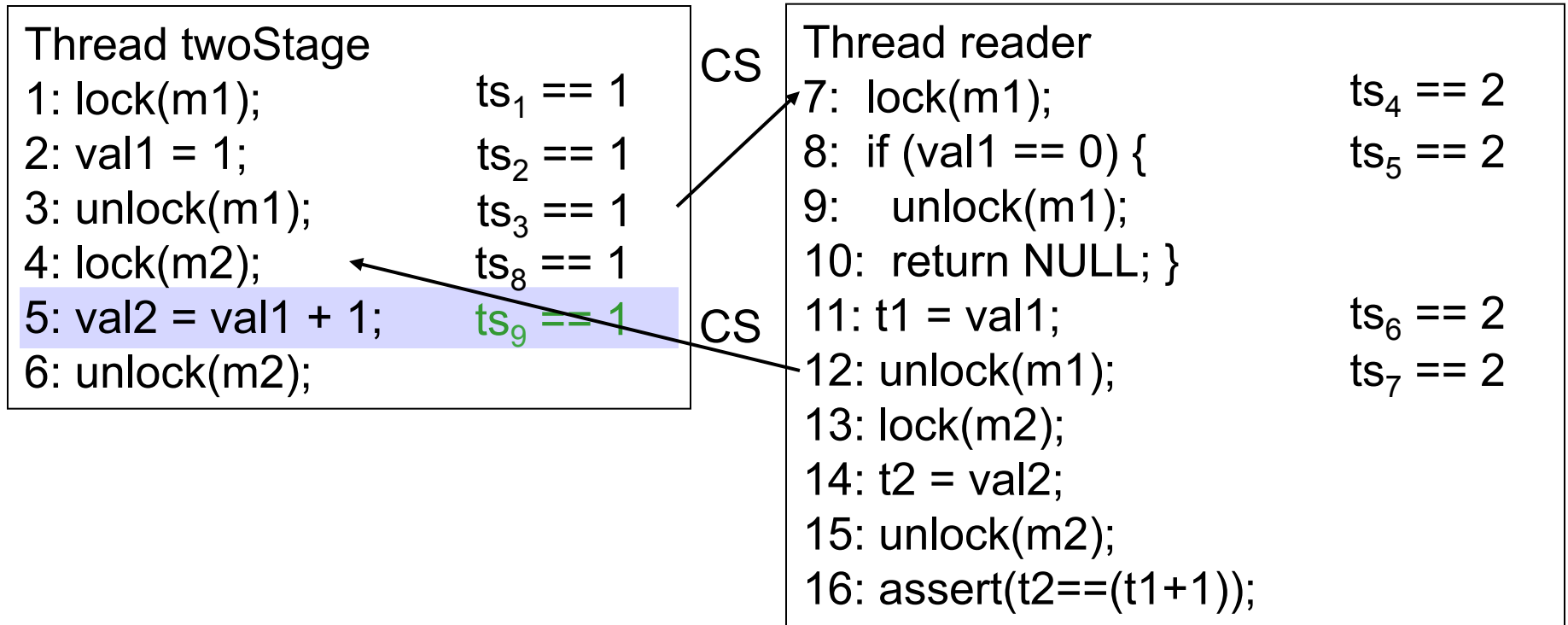


Schedule Recording – Interleaving #1

statements: 1-2-3-7-8-11-12-4-5

twoStage-ECS: (1,1)-(2,2)-(3,3)-(4,8)-(5,9)

reader-ECS: (7,4)-(8,5)-(11,6)-(12,7)

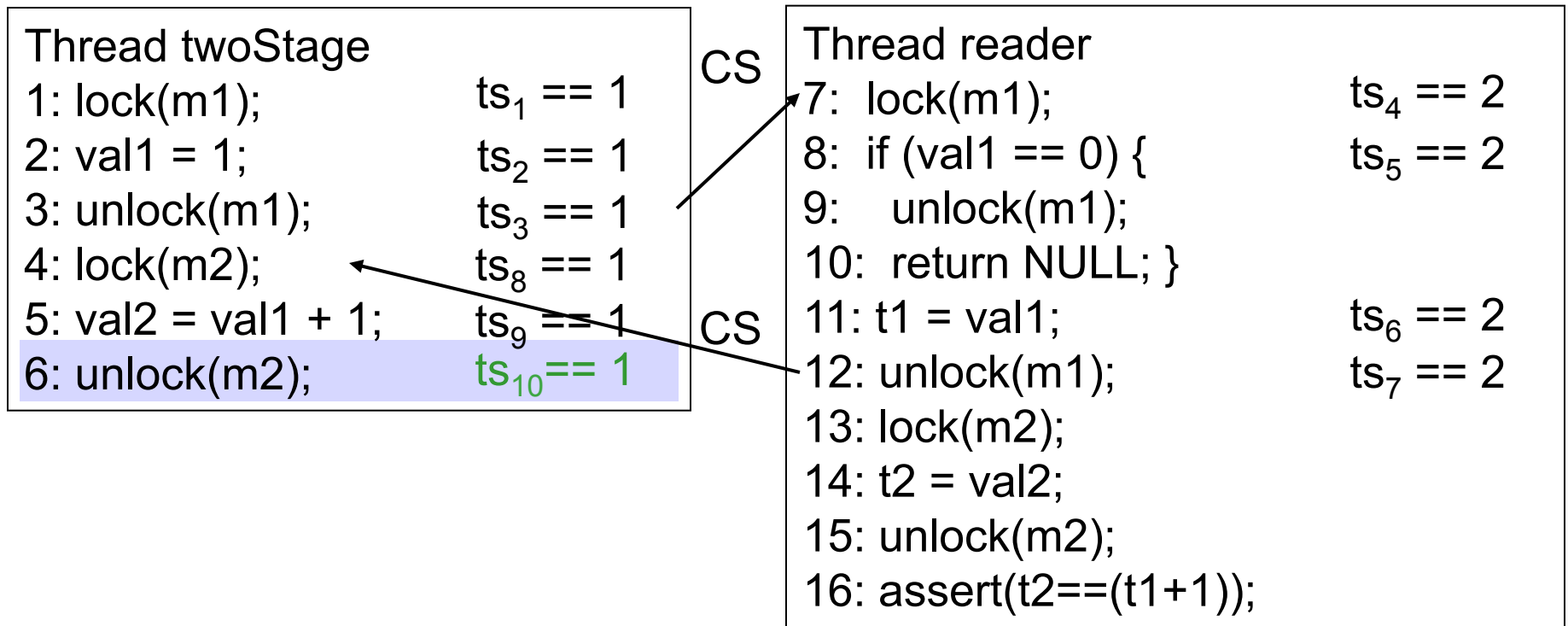


Schedule Recording – Interleaving #1

statements: 1-2-3-7-8-11-12-4-5-6

twoStage-ECS: (1,1)-(2,2)-(3,3)-(4,8)-(5,9)-(6,10)

reader-ECS: (7,4)-(8,5)-(11,6)-(12,7)

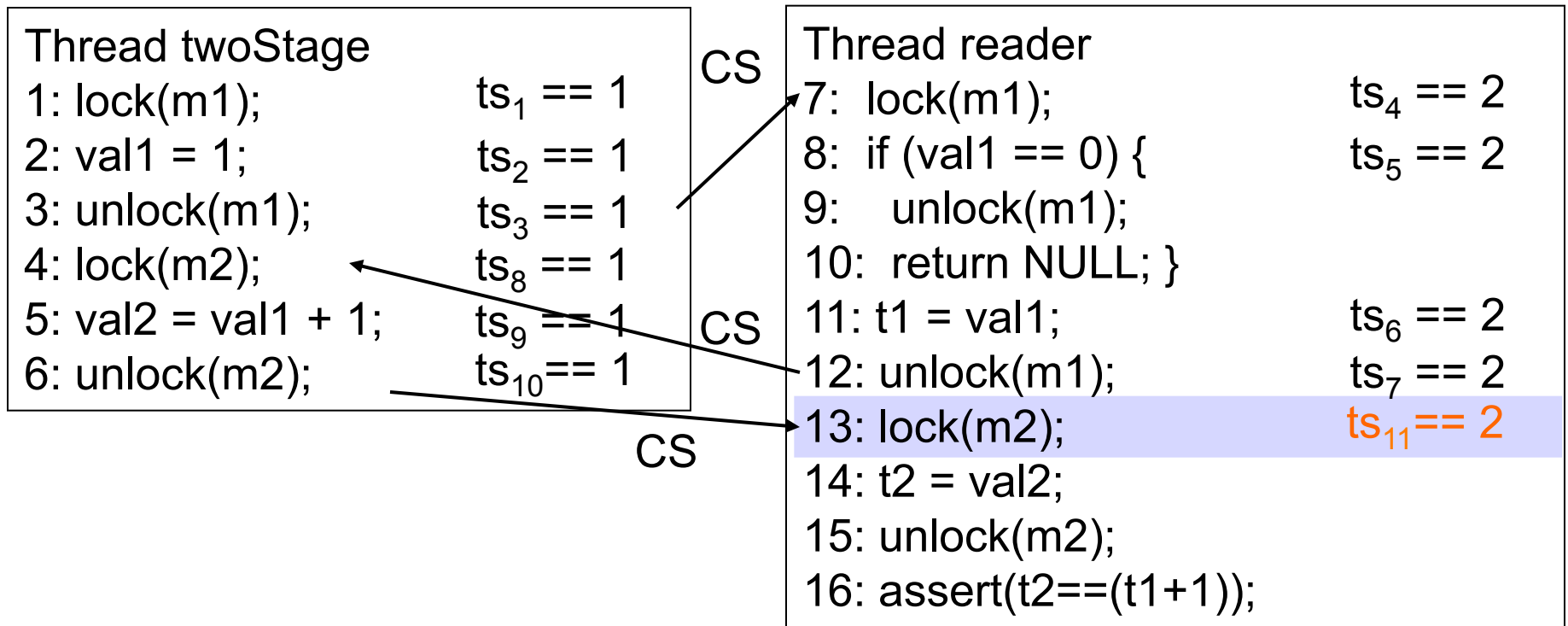


Schedule Recording – Interleaving #1

statements: 1-2-3-7-8-11-12-4-5-6-13

twoStage-ECS: (1,1)-(2,2)-(3,3)-(4,8)-(5,9)-(6,10)

reader-ECS: (7,4)-(8,5)-(11,6)-(12,7)-(13,11)

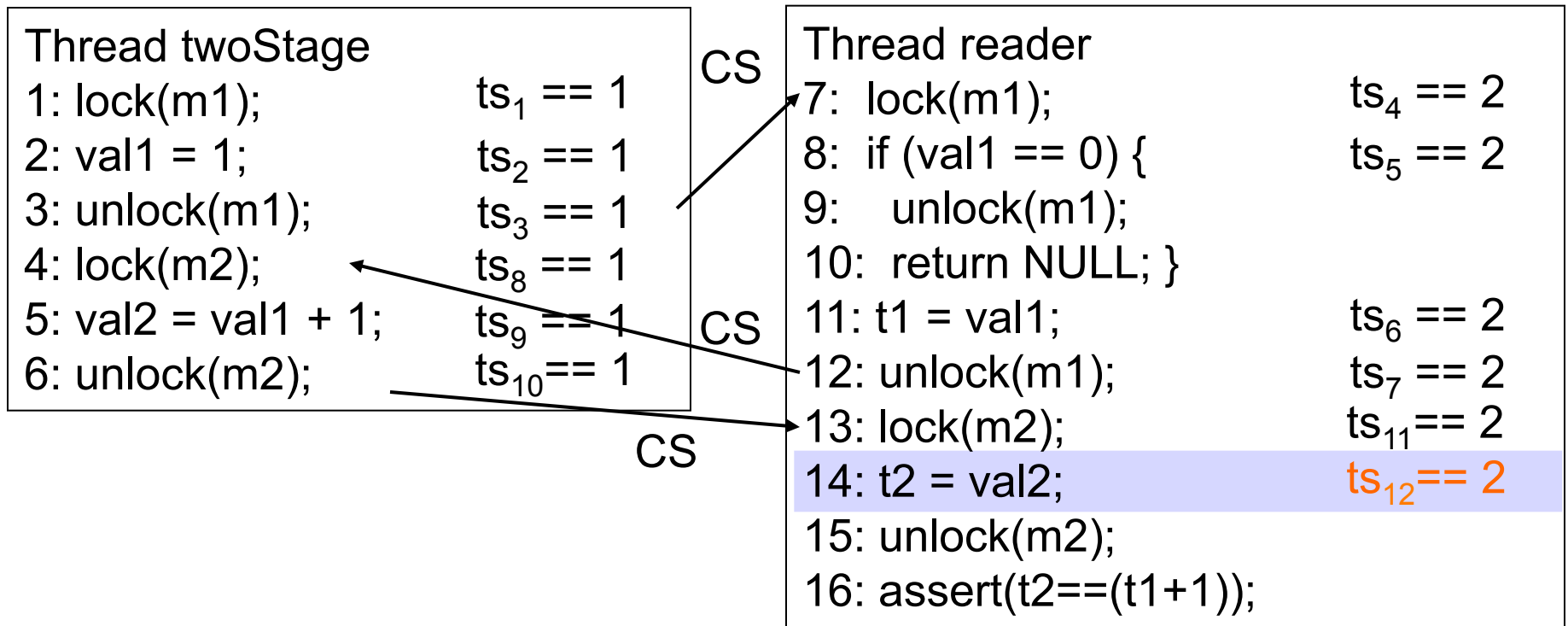


Schedule Recording – Interleaving #1

statements: 1-2-3-7-8-11-12-4-5-6-13-14

twoStage-ECS: (1,1)-(2,2)-(3,3)-(4,8)-(5,9)-(6,10)

reader-ECS: (7,4)-(8,5)-(11,6)-(12,7)-(13,11)-(14,12)

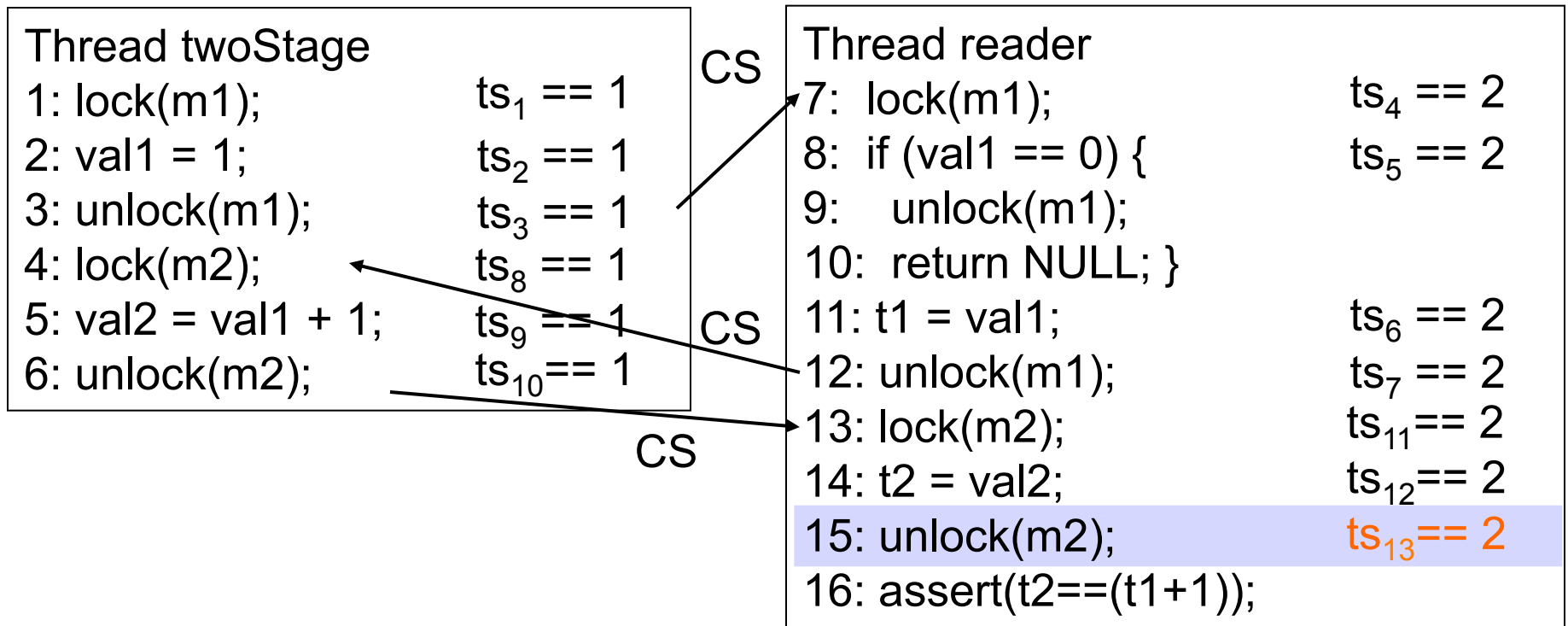


Schedule Recording – Interleaving #1

statements: 1-2-3-7-8-11-12-4-5-6-13-14-15

twoStage-ECS: (1,1)-(2,2)-(3,3)-(4,8)-(5,9)-(6,10)

reader-ECS: (7,4)-(8,5)-(11,6)-(12,7)-(13,11)-(14,12)-(15,13)

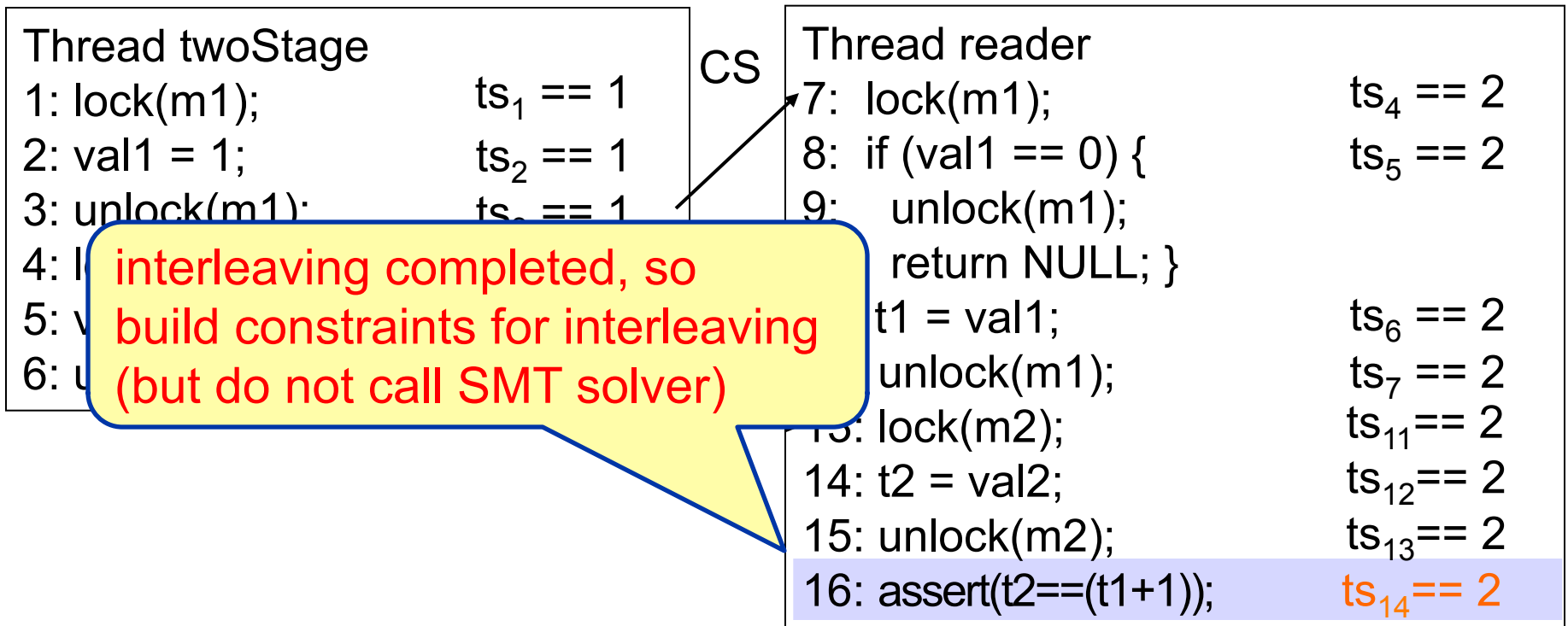


Schedule Recording – Interleaving #1

statements: 1-2-3-7-8-11-12-4-5-6-13-14-15-16

twoStage-ECS: (1,1)-(2,2)-(3,3)-(4,8)-(5,9)-(6,10)

reader-ECS: (7,4)-(8,5)-(11,6)-(12,7)-(13,11)-(14,12)-(15,13)-(16,14)

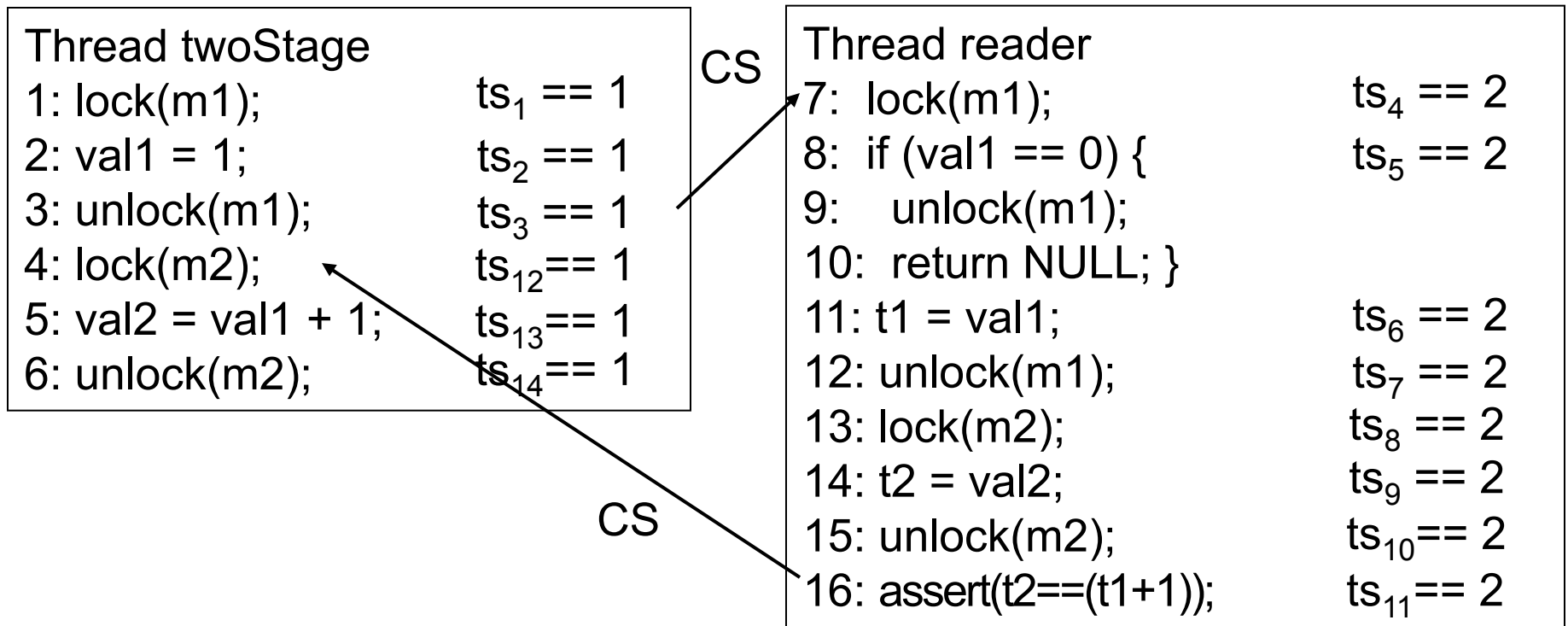


Schedule Recording – Interleaving #1

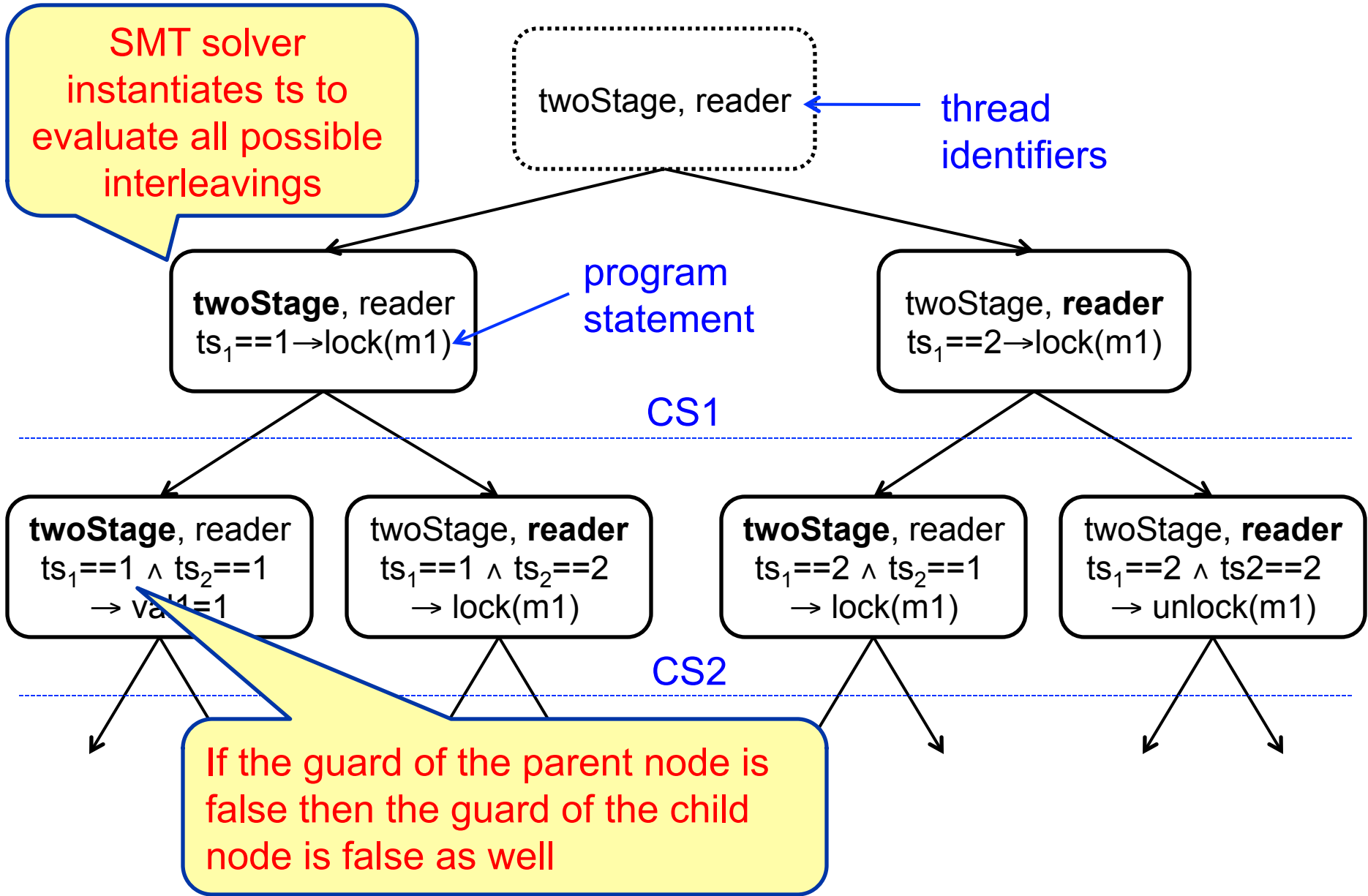
statements: 1-2-3-7-8-11-12-13-14-15-16-4-5-6

twoStage-ECS: (1,1)-(2,3)-(3,4)-(4,12)-(5,13)-(6,14)

reader-ECS: (7,4)-(8,5)-(11,6)-(12,7)-(13,8)-(14,9)-(15,10)-(16,11)



Schedule Recording: Execution Paths



Observations about the schedule recoding approach

- systematically explore the thread interleavings as before, but:
 - add schedule guards to record in which order the scheduler has executed the program
 - encode all execution paths into one formula
 - bound the number of context switches
 - exploit which transitions are enabled in a given state
- number of threads and context switches grows very large quickly, and easily “blow-up” the solver:
 - there is a clear trade-off between usage of time and memory resources

Intended learning outcomes

- Introduce typical **BMC architectures** for verifying **software systems**
- Understand **communication models** and **typical errors** when writing **concurrent programs**
- Explain **explicit schedule** exploration of multi-threaded software
- Explain **sequentialization methods** to convert concurrent programs into sequential ones

Sequentialization

Observation:

Building verification tools for full-fledged concurrent languages is difficult and expensive...

... but scalable verification techniques exist for sequential languages

- Abstraction techniques
- SAT/SMT techniques (i.e., bounded model checking)

⇒ How can we leverage these?

Sequentialization

⇒ How can we leverage these?

Sequentialization:

convert **concurrent** programs into **sequential** programs such that reachability is preserved

- replace **control non-determinism** by **data non-determinism**
- **P'** simulates all computations (within certain bounds) of **P**
- **source-to-source transformation**: $T_1 \parallel T_2 \rightsquigarrow T'_1 ; T'_2$

⇒ reuse existing tools (largely) unchanged

⇒ easy to target multiple back-ends

⇒ easy to experiment with different approaches

A first sequentialization: KISS

KISS: Keep It Simple and Sequential [\[Quadeer-Wu, PLDI' 04\]](#)

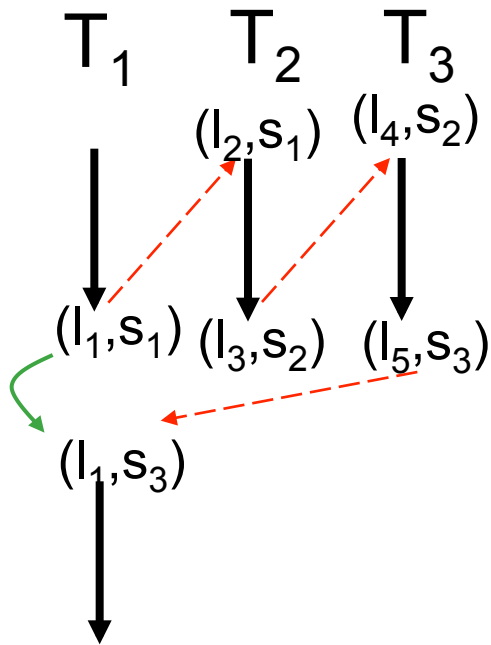
Under-approximation (subset of interleavings)

Thread creation → function call

- **at context-switches either:**
 - o the active thread is terminated or
 - o a not yet scheduled thread is started
(by calling its main function)

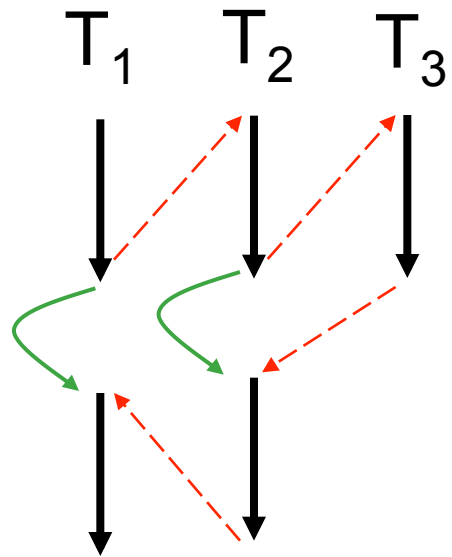
- **when a thread is terminated either:**
 - o the thread that has called it is resumed (if any) or
 - o a not yet scheduled thread is started

KISS schedules



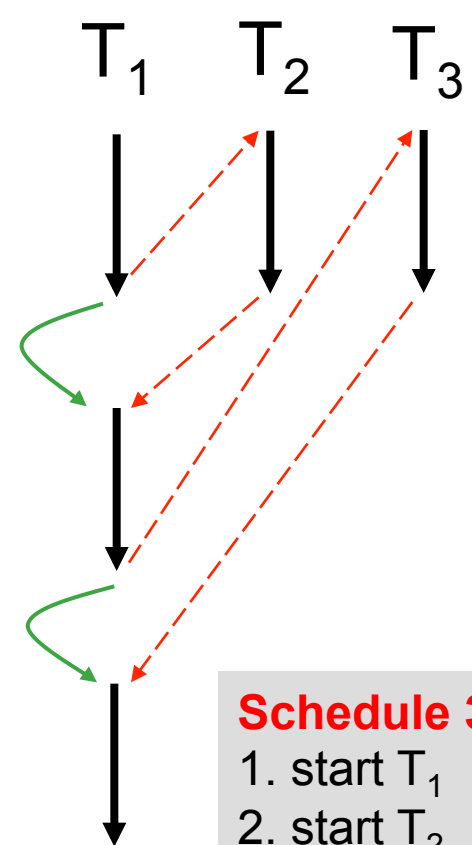
Schedule 1:

1. Start T_1
2. Start T_2
3. Terminate T_2
4. start T_3
5. terminate T_3
6. Resume T_1



Schedule 2:

1. start T_1
2. start T_2
3. start T_3
4. terminate T_3
5. resume T_2
6. terminate T_2
7. resume T_1

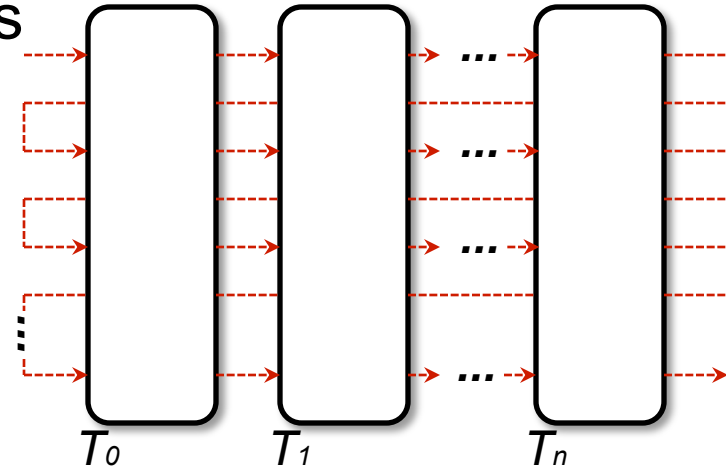


Schedule 3:

1. start T_1
2. start T_2
3. terminate T_2
4. resume T_1
5. start T_3
6. terminate T_3
7. resume T_1

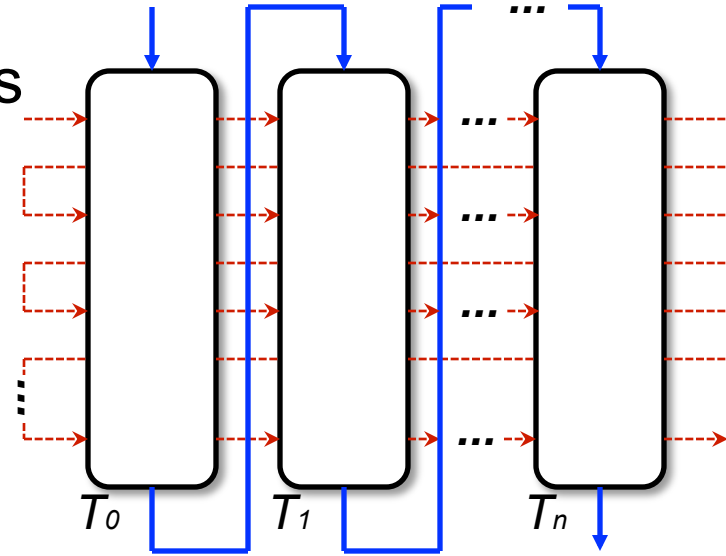
LR sequentialization

- considers only round-robin schedules with k rounds



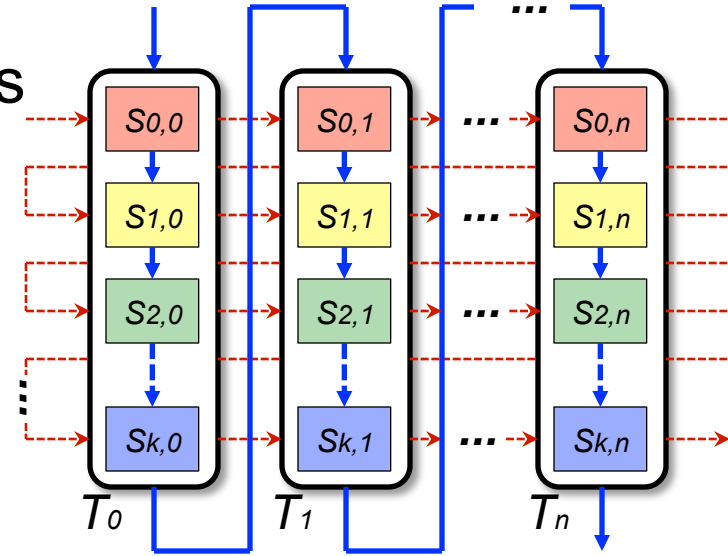
LR sequentialization

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 - **thread** → **function**, run to completion



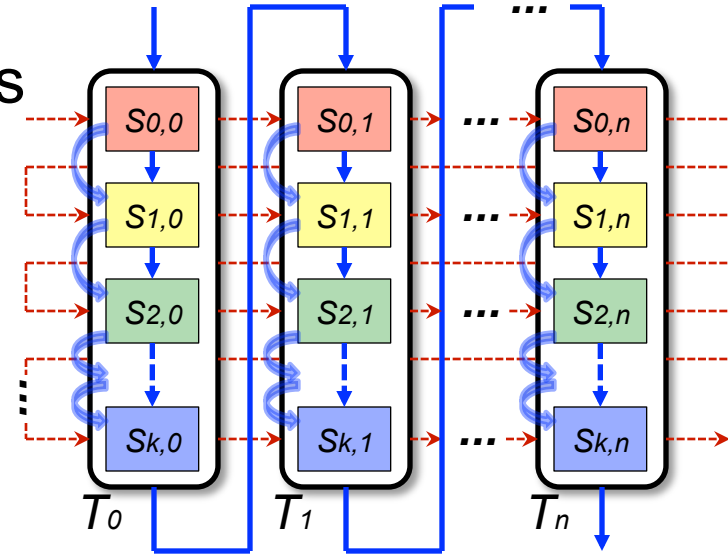
LR sequentialization

- considers only round-robin schedules with k rounds
 - **thread** → **function**, run to completion
- global memory copy for each round
 - **scalar** → **array**



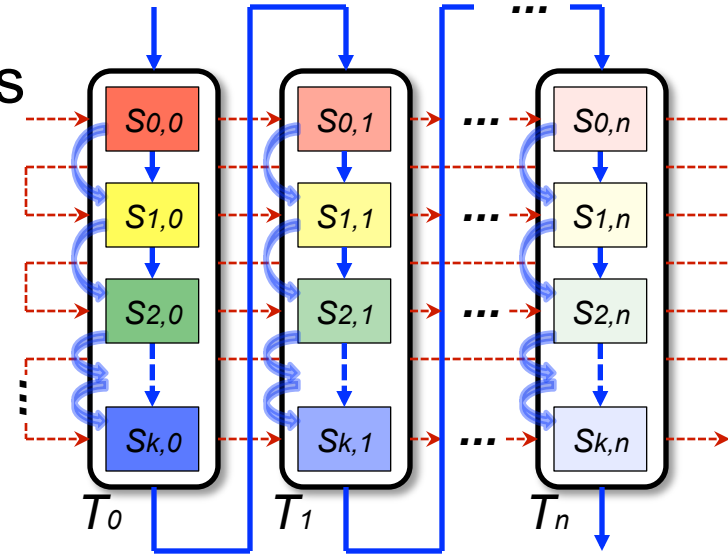
LR sequentialization

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- **context switch** → **round counter++**



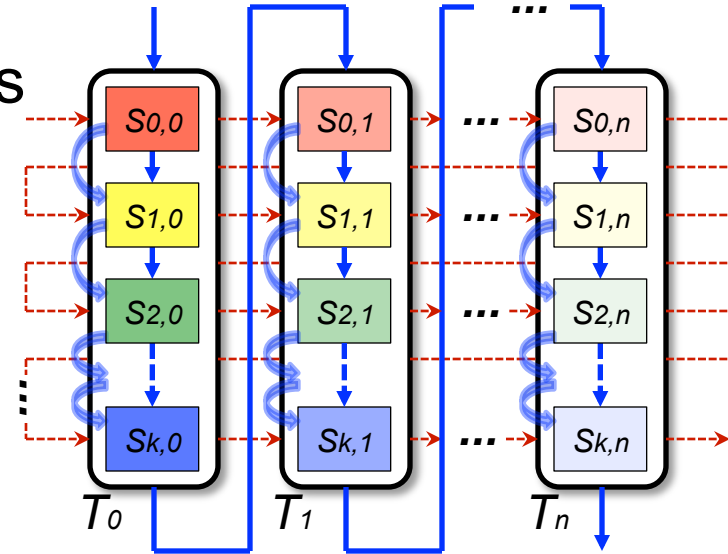
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 - **scalar** → **array**
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- first thread starts with non-deterministic memory contents
 - other threads continue with content left by predecessor
- checker prunes away inconsistent simulations
 - **assume**($S_{k+1,0} == S_{k,n}$);
 - requires second set of memory copies
 - errors can only be checked at end of simulation
 - o requires explicit error checks



LR sequentialization - implementation

```
//shared vars
typeg1 g1; typeg2 g2; ...

//thread functions
t(){
  typex1 x1; typex2 x2; ...
  stmt1 ;
  stmt2 ;
  ...
} ...

main(){
  ...
}
```

```
//shared vars
typeg1 g1[K]; typeg2 g2[K]; ...
uint round=0; bool ret=0; //aux vars

// context-switch simulation
cs() {
  unsigned int j; j= nondet();
  assume(round +j < K); round+=j;
  if (round==K-1 && nondet()) ret=1;
}

//thread functions
t(){
  typex1 x1; typex2 x2; ...
  cs(); if (ret) return; stmt1[round];
  cs(); if (ret) return; stmt2[round];
  ...
} ...

main_thread(){
  ...
}

main(){ ... } //next slide
```

LR sequentialization - implementation

```
main(){
  typeg1 _g1[K]; typeg2 _g2[K]; ...
  // first thread starts with non-deterministic memory contents
  for (i=1; i<K; i++){
    _g1[i] = g1[i] = nondet();
    _g2[i] = g2[i] = nondet();
    ...
  }
  // thread simulations
  t[0] = main_thread;
  round_born[0] = 0; is_created[0] = 1;
  for (i=0; i<N; i++){
    if(is_created[i]){
      ret=0;
      round = round_born[i];
      t[i](); }
  }
  // consistency check
  for (i=0; i<K-1; i++){
    assume(_g1[i+1] == g1[i]);
    assume(_g2[i+1] == g2[i]);
    ...
  }
  // error detection
  assert(err == 0); }
```

LR sequentialization - implementation

- **Corral** (SMT-based analysis for Boogie programs)
 - [Lal-Qadeer-Lahiri, CAV'12]
 - [Lal-Qadeer, FSE'14]
- **CSeq** (code-to-code translation for C + pthreads)
 - [Fischer-Inverso-Parlato, ASE'13]
- **Rek** (for Real-time Embedded Software Systems)
 - [Chaki-Gurfinkel-Strichman, FMCAD'11]
- **Storm**: implementation for C programs
 - [Lahiri-Qadeer-Rakamaric, CAV'09]
 - [Rakamaric, ICSE'10]

Summary

- Described **typical architectures** employed by BMC tools (e.g., CBMC, ESBMC and LLBMC):
 - language support, built-in safety checks, and non-deterministic modelling
 - general approach to verify programs, including program transformations and bit-blasting

Summary

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- Introduced the difficulties to write concurrent programs, typical **concurrency errors** and **communication models**

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 - language support, built-in safety checks, and non-deterministic modelling
 - general approach to verify programs, including program transformations and bit-blasting
- Introduced the difficulties to write concurrent programs, typical **concurrency errors** and **communication models**
- Presented state-of-the-art concurrency verification approaches, including: **explicit schedule exploration** and **sequentialization**