

ICTAC 2018

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Finding Rare Concurrent Programming Bugs

An Automatic, Symbolic, Randomized, and Parallelizable Approach

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Concurrent programs

Concurrency is everywhere in computing

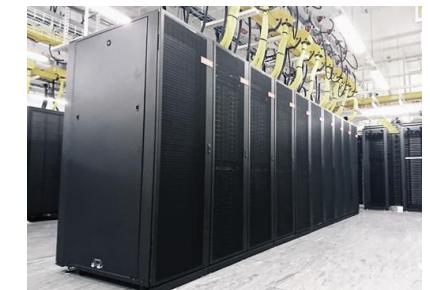
- Embedded systems
- multi-core architectures
- worldwide networks

Large concurrent computing resources are available

- clusters



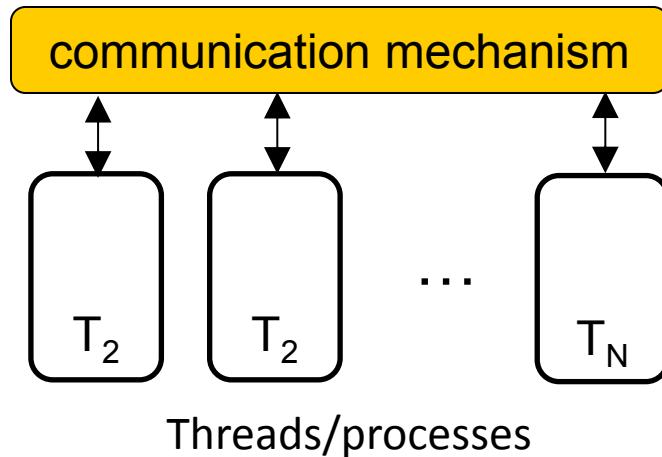
- cloud computing



There is a big demand for concurrent software

- enterprise customer services (e.g., telecom companies)
- government services (e.g., tax payment services)
- social networks, cloud services, ...

Developing concurrent programs is difficult



Programmers have to guarantee

- correctness of sequential execution of each individual thread
- under nondeterministic interferences from other threads
(interleavings)

Developing concurrent programs is difficult

What happens here...???

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

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

int main (void)
{
    id1 = thread_create(P);
    id2 = thread_create(P);
    join( id1 );
    join( id2 );
    assert(n == 20);
}
```

Can the assert fail?

Developing concurrent programs is difficult

What happens here...???

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

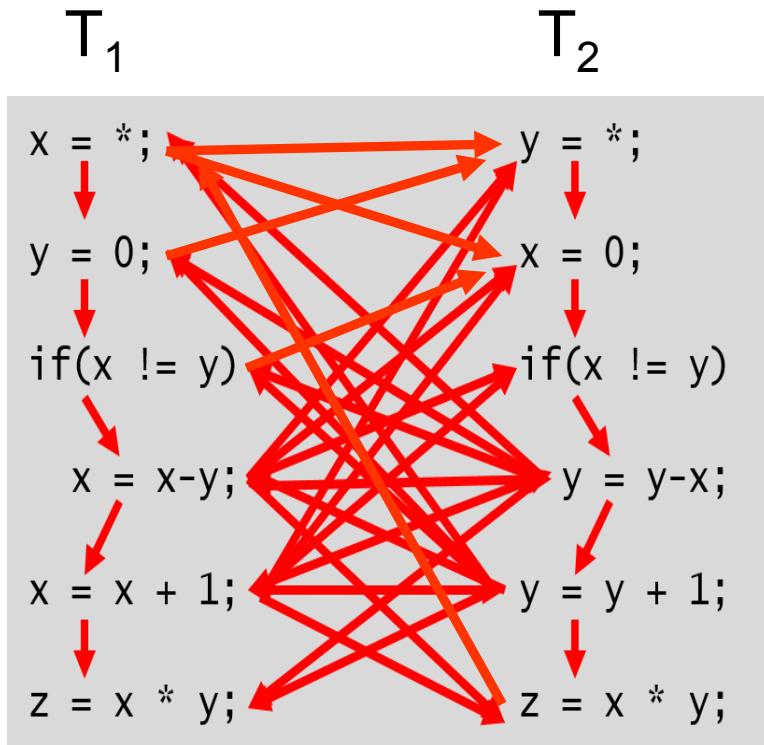
int P(void) {
    int tmp, i=1;
    while (i<=10) {
        tmp = n;
        n = tmp + 1;
        i++;
    }
}

int main (void)
{
    id1 = thread_create(P);
    id2 = thread_create(P);
    join( id1 );
    join( id2 );
    assert(n > 2);
}
```

Scale of the challenge: #interleavings

2 threads with N LOC

#interleavings: $\binom{2N}{N}$



Scenario 1:

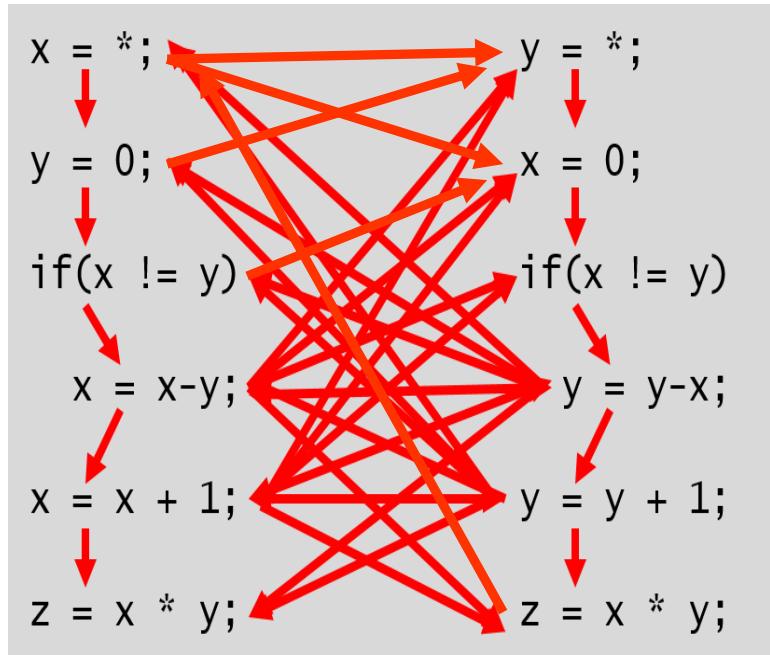
- N=40
- If 1 billion interleavings are simulated per second
➤ 3.4 million years

Scenario 2:

- N=150
- # interleavings > estimated # atoms in the known universe! $\geq 10^{80}$

Bug-finding: finding needles in a haystack

Set of interleavings



Haystack

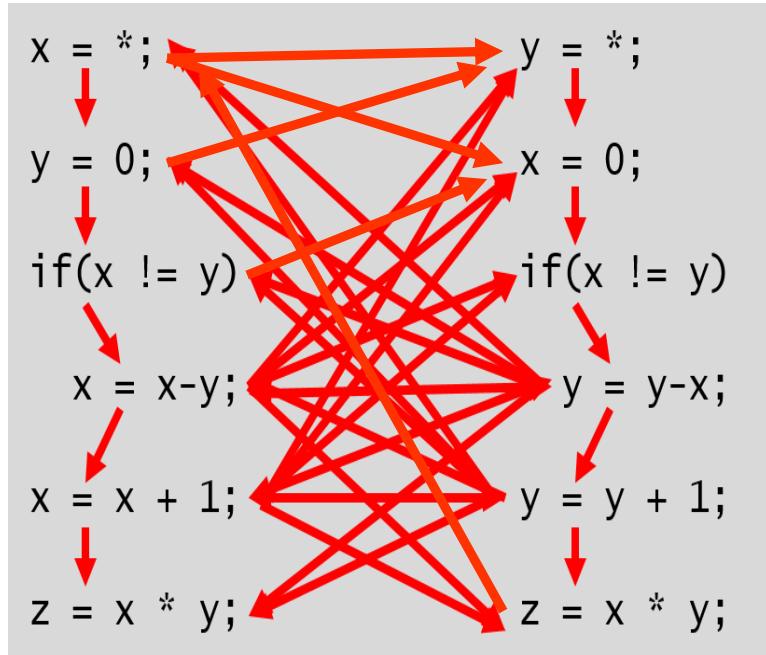


**Testing is easy when
many interleavings are buggy**



Bug-finding: finding A needle in a haystack

Set of interleavings



Haystack



... but is hard when buggy

interleavings are **rare**

⇒ ... needs to be **complemented** by automated **analyses** that handle **interleavings symbolically**

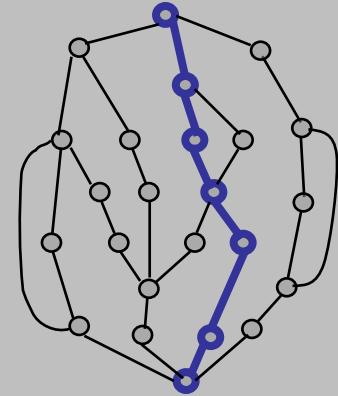


Bounded Model Checking (BMC) of concurrent programs

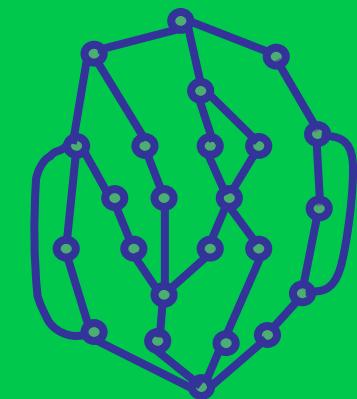


Testing vs Bounded Model Checking

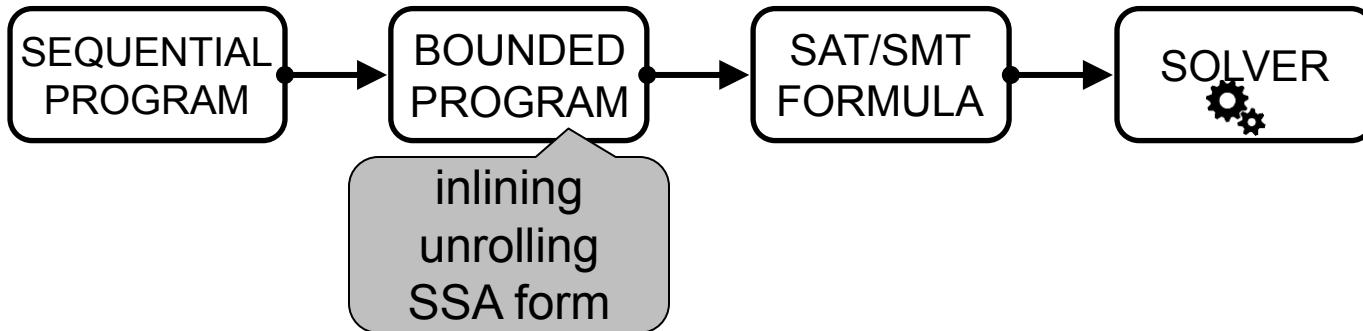
- Testing:
 - checks some executions
 - may miss errors
 - fast



- Bounded Model Checking (BMC)
 - Exhaustively explores all executions
 - ▷ bounding loop iterations
 - ▷ bounding context-switches, etc.
 - Can be extremely resource-hungry



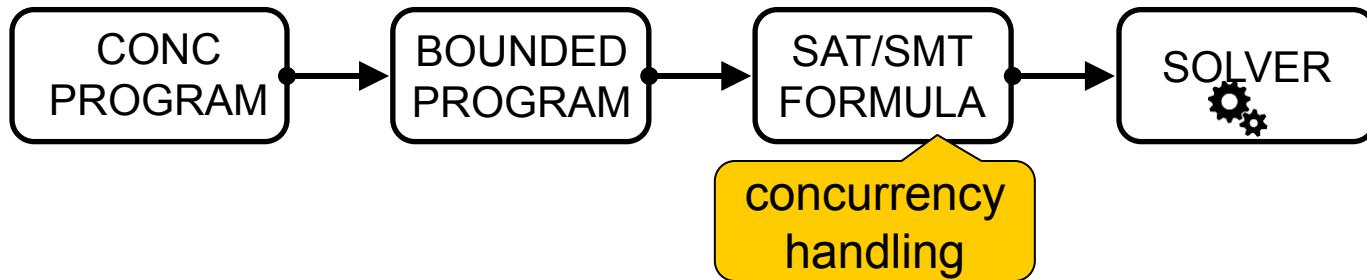
BMC for sequential C programs



tools

- BLITZ [Cho, D'Silva, Song – ASE'13]
- CBMC [Clarke, Kroening, Lerda – TACAS'04]
- LLBMC [Falke, Merz, Sinz – ASE'13]
- ESBMC [Cordeiro, Fischer, Marques-Silva – ASE'09]

BMC for concurrent C programs



SAT/SMT approach

- encode each thread as in the sequential case
- add a conjunct for shared memory operations
- all possible interleavings in the bounded program

$$\Phi_{\text{threads}} \wedge \Phi_{\text{concurrency}}$$

papers

- [[Sinha, Wang – POPL’11](#)]
- [[Algave, Kroening, Tautschnig – CAV’13](#)] CBMC

Sequentialization targeting BMC

Sequentialization: motivations

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

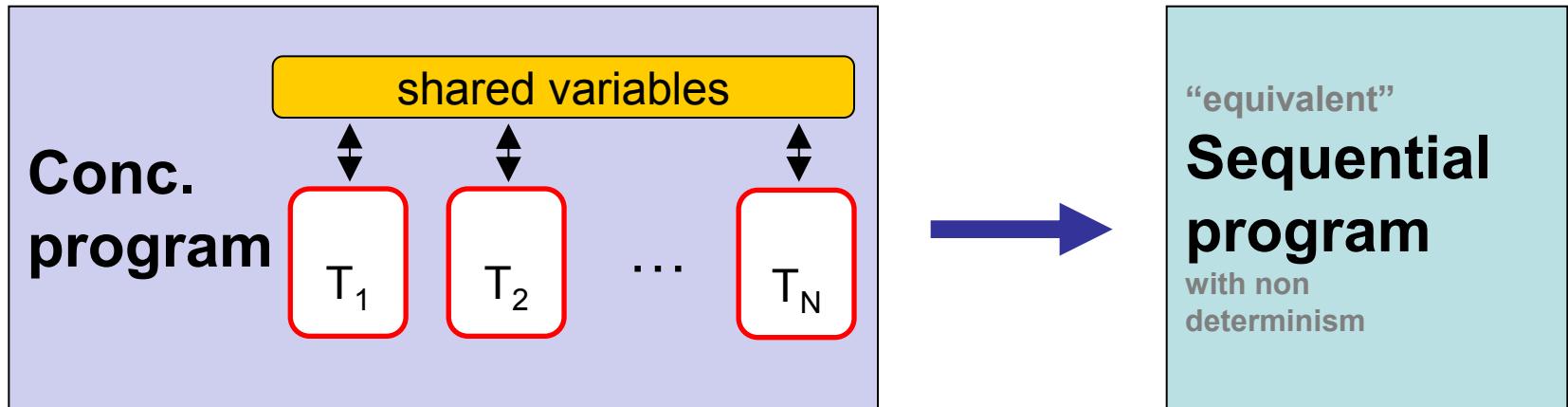
... but scalable verification techniques exist for sequential languages

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

⇒ **Can we leverage these?**

Sequentialization as a code-to-code translation

Code-to-code translation from multithreaded recursive programs to sequential programs that preserves **reachability**



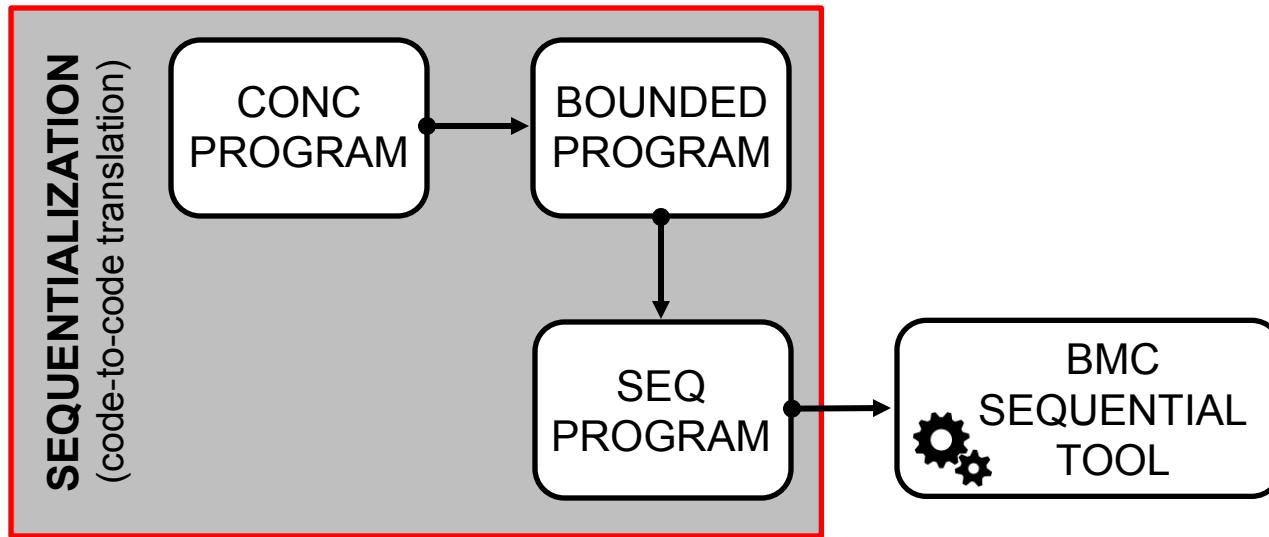
Use existing automatic verification techniques designed for sequential programs to analyze concurrent programs

[Inverso–Tomasco–Fischer–La Torre–Parlato, CAV’14]

Lazy-CSeq: Schema Overview

(a sequentialization for BMC)

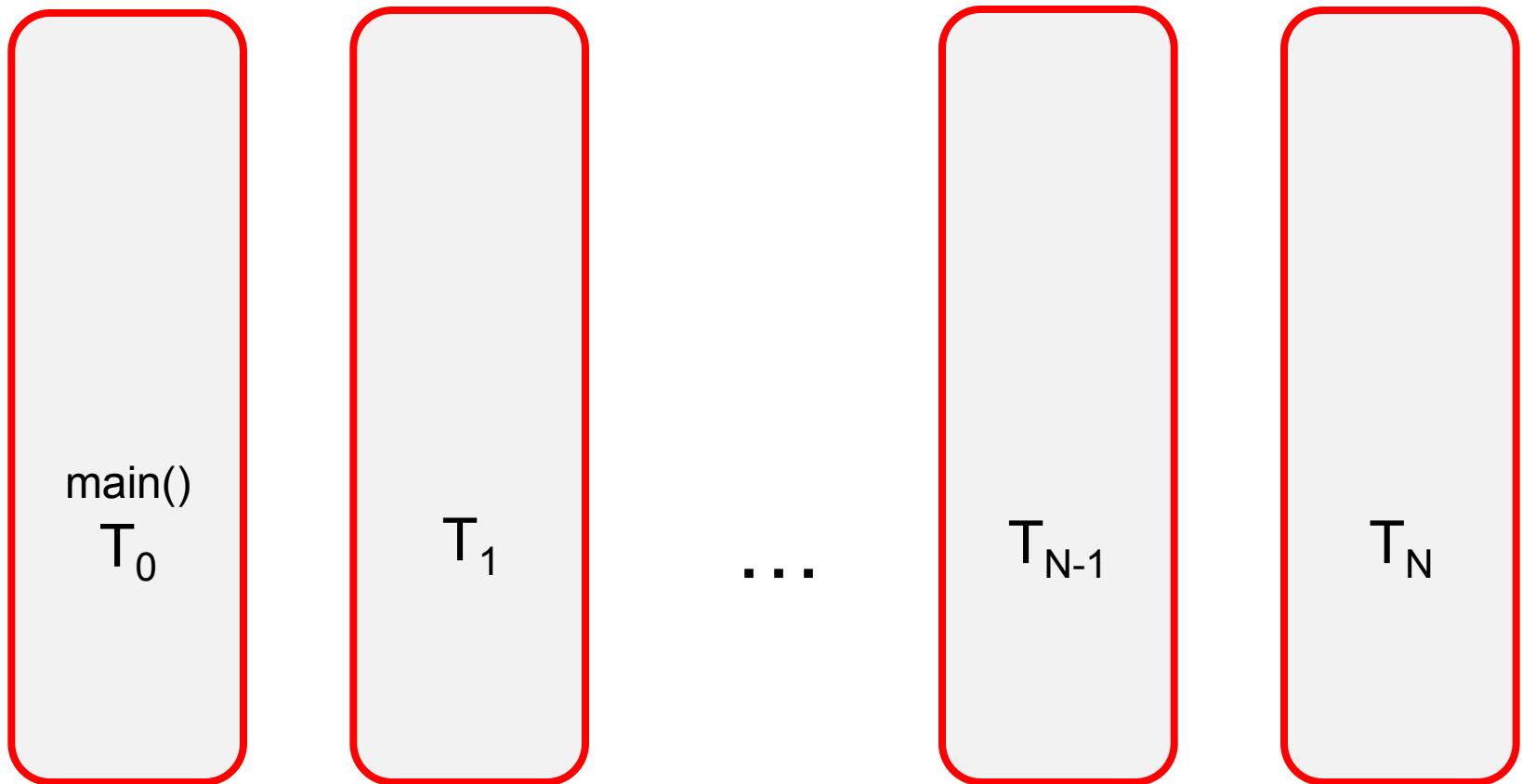
Lazy-CSeq approach



We have designed
new sequentializations targeting BMC
scalable analyses + surprisingly simple

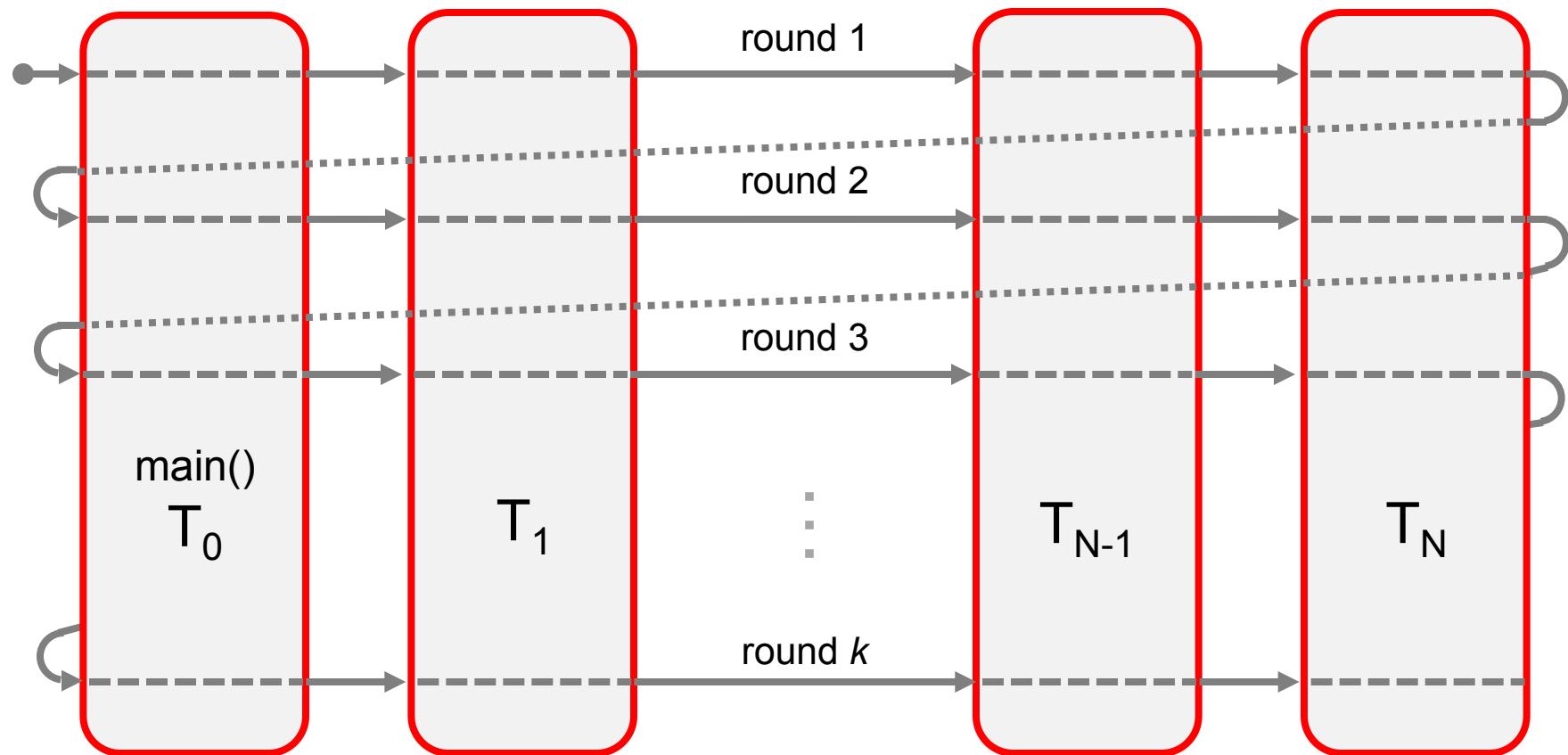
Lazy-CSeq

Bounded Concurrent Programs



- **no loops**
- **no function calls**
- **control flow only forward**
- **one procedure for each thread**

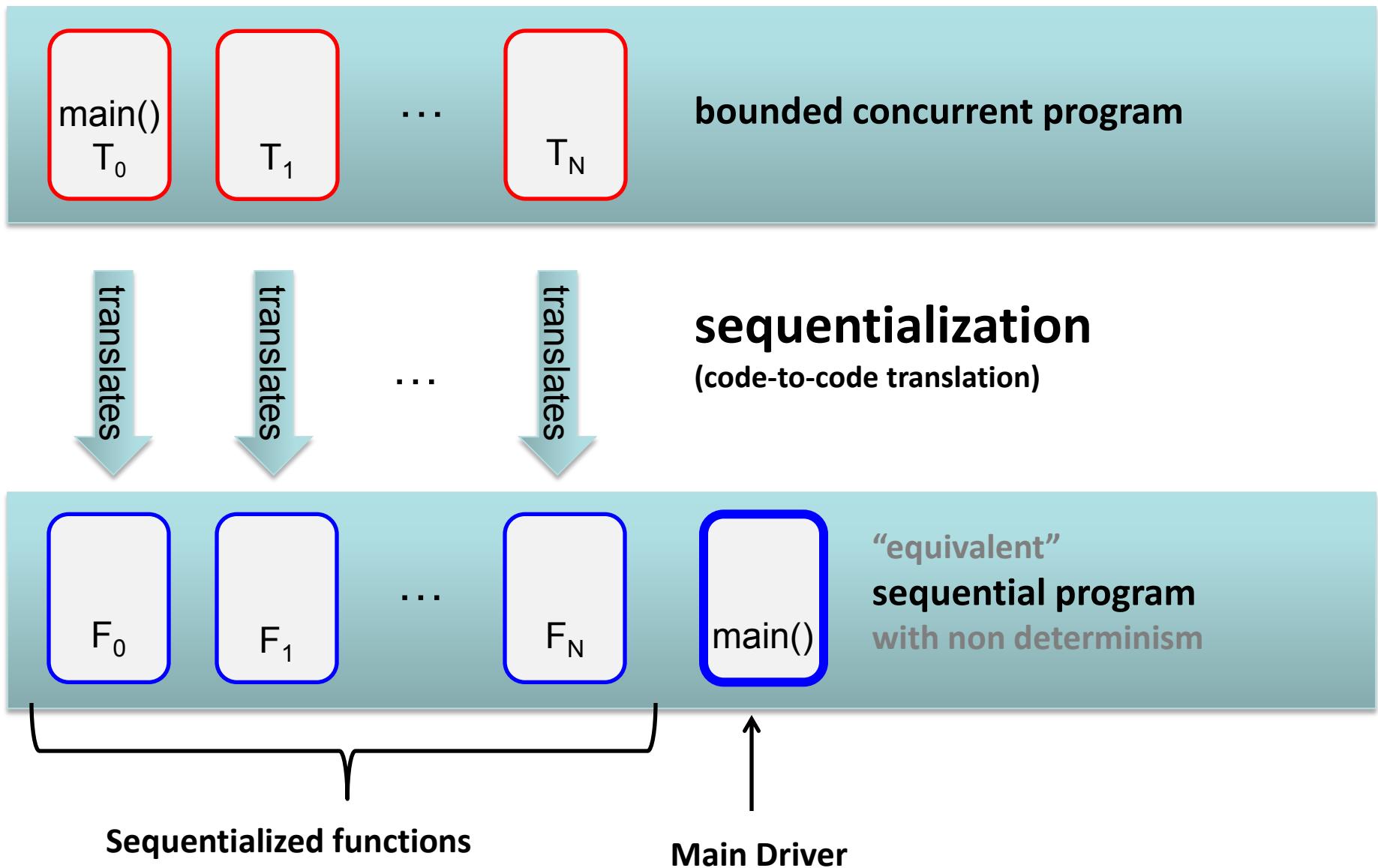
Round Robin Schedule



Lazy-Cseq sequentialization:

- captures all bounded Round-Robin computations for a given bound
- error manifest themselves within very few rounds

Schema Overview



Naïve Lazy Sequentialization

main driver

```
pc0=0; ... pcN=0;  
local0; ... localk;  
  
main() {  
    for (r=0; r<K; r++)  
        for (i=0; i<N; i++)  
            // simulate  $T_i$   
            if (activei)  
                Fi ();  
}
```

- Add a global pc for each thread
- thread locals → thread global

Naïve Lazy Sequentialization

main driver

```
pc0=0; ... pcN=0;  
local0; ... localk;
```

```
main() {  
    for (r=0; r<K; r++)  
        for (i=0; i<N; i++)  
            // simulate  $T_i$   
            if (activei)  
                Fi();  
}
```

for each round

for each thread T_i
simulate T_i

Naïve Lazy Sequentialization

main driver

```
pc0=0; ... pcN=0;  
local0; ... localk;  
  
main() {  
    for (r=0; r<K; r++)  
        for (i=0; i<N; i++)  
            // simulate  $T_i$   
            if (activei)  
                Fi ();  
}
```

F_i ()

```
0:     stmt0;  
1:     stmt1;  
2:     stmt2;  
.  
.  
.  
M:     stmtM;
```

Naïve Lazy Sequentialization

main driver

```
pc0=0; ... pcN=0;  
local0; ... localk;  
  
main() {  
    for (r=0; r<K; r++)  
        for (i=0; i<N; i++)  
            // simulate  $T_i$   
            if (activei)  
                Fi();  
}
```

F_i ()

```
switch(pci) {  
    case 0: goto 0;  
    case 1: goto 1;  
    case 2: goto 2;  
    ...  
    case M: goto M;  
}  
  
0:      stmt0;  
1:      stmt1;  
2:      stmt2;  
...  
...  
M:      stmtM;
```

resume mechanism

Naïve Lazy Sequentialization

main driver

```
pc0=0; ... pcN=0;  
local0; ... localk;  
  
main() {  
    for (r=0; r<K; r++)  
        for (i=0; i<N; i++)  
            // simulate  $T_i$   
            if (activei)  
                Fi();  
}
```

F_i ()

```
switch(pci) {  
    case 0: goto 0;  
    case 1: goto 1;  
    case 2: goto 2;  
    ...  
    case M: goto M;  
}  
  
0: CS(0); stmt0;  
1: CS(1); stmt1;  
2: CS(2); stmt2;  
...  
.  
.  
.  
M: CS(M); stmtM;
```

Context-switch mechanism:

```
#define CS(j)  
    if (* ) { pci=j; return; }
```

Naïve Lazy Sequentialization



Formula encoding:

goto statement to formula

add a guard for each crossing
control-flow edge

= $O(M^2)$ guards

```
switch(pci) {  
    case 0: goto 0;  
    case 1: goto 1;  
    case 2: goto 2;  
    ...  
    case M: goto M;  
}  
  
0: CS(0); stmt0;  
1: CS(1); stmt1;  
2: CS(2); stmt2;  
...  
.  
.  
.  
M: CS(M); stmtM;
```

Context-switch mechanism:

```
#define CS(j)  
    if (* ) { pci=j; return; }
```

Lazy-CSeq sequentialization

main driver

```
pc0=0; ... pcN=0;  
local0; ... localk;  
nextCS;  
main()  
  for (r=0; r<K; r++)  
    for (i=0; i<N; i++)  
      // simulate  $T_i$   
      if (activei)  
        nextCS = nondet;  
        assume (nextCS >= pci)  
        Fi();  
        pci = nextCS;
```

Guess next context-switch point

Lazy-CSeq sequentialization

main driver

```
pc0=0; ... pcN=0;  
local0; ... localk;  
nextCS;  
main()  
  for (r=0; r<K; r++)  
    for (i=0; i<N; i++)  
      // simulate  $T_i$   
      if (activei)  
        nextCS = nondet;  
        assume (nextCS>=pci)  
        Fi();  
        pci = nextCS;
```

F_i ()

skip
...

```
0: J(0) ; stmt0;  
1: J(1) ; stmt1;  
2: J(2) ; stmt2;  
.  
.  
.  
.  
.  
.  
.  
.  
.  
.  
M: J(M) ; stmtM;
```



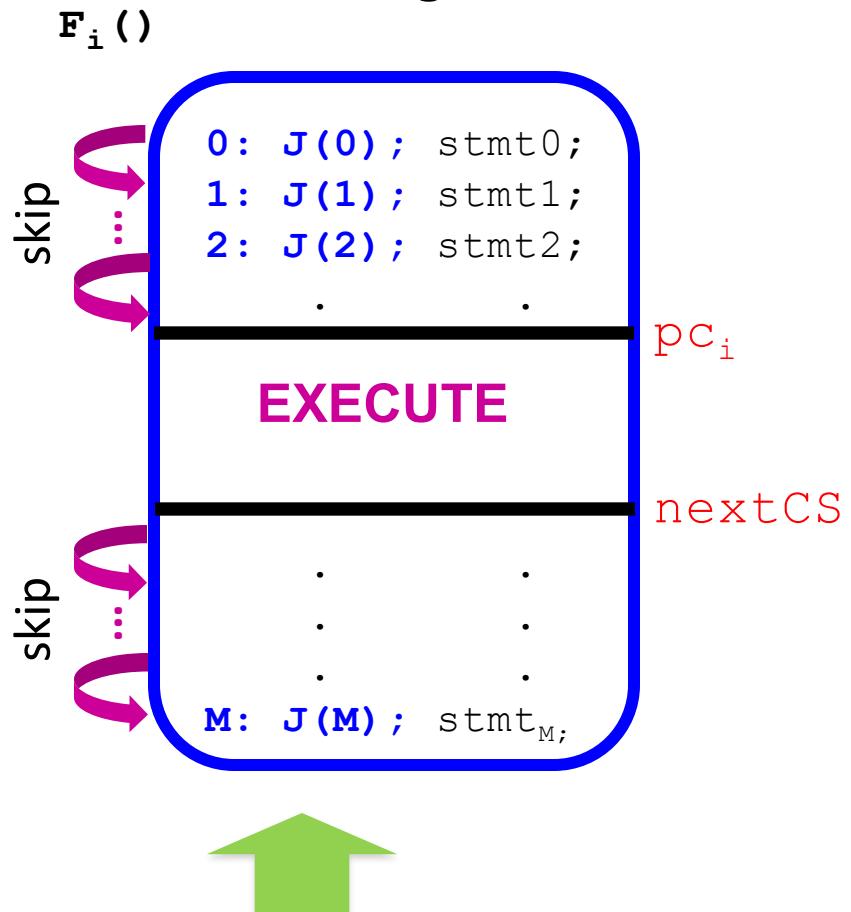
```
#define J(j)  
  if (j<pci || j>=nextCS) goto j+1;
```

Lazy-CSeq sequentialization

main driver

```
pc0=0; ... pcN=0;  
local0; ... localk;  
nextCS;  
main()  
  for (r=0; r<K; r++)  
    for (i=0; i<N; i++)  
      // simulate Ti  
      if (activei)  
        nextCS = nondet;  
        assume (nextCS>=pci)  
        Fi();  
        pci = nextCS;
```

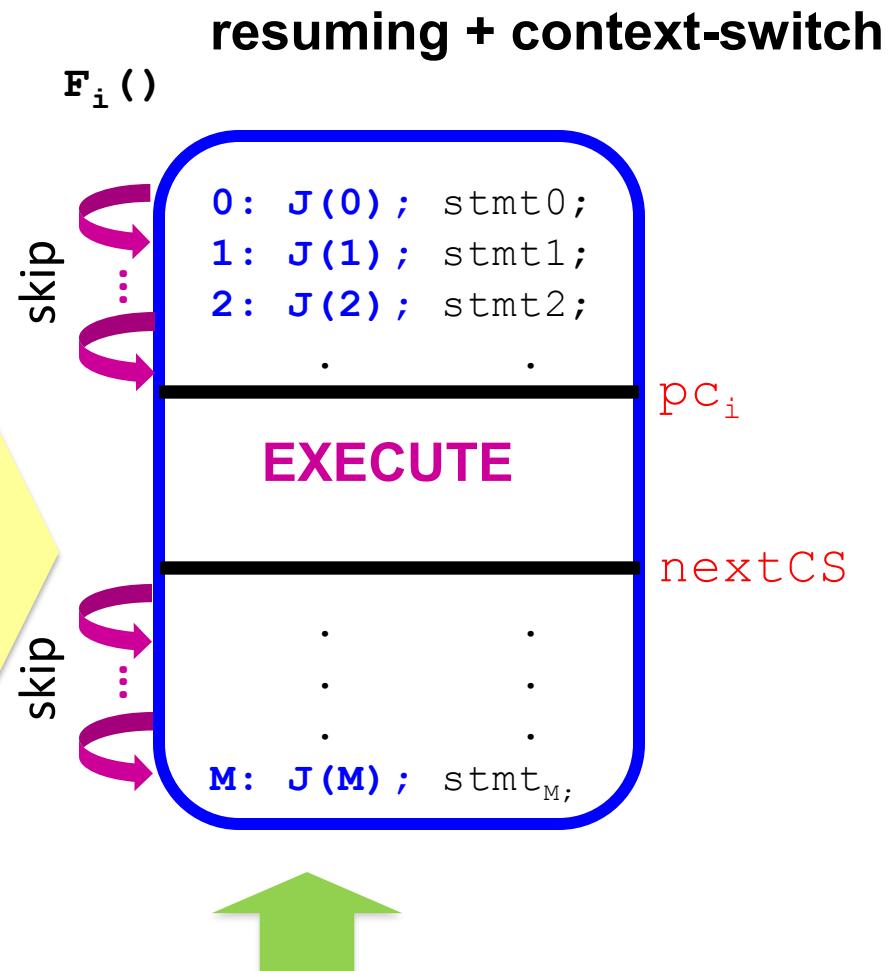
resuming + context-switch



```
#define J(j)  
  if (j<pci || j>=nextCS) goto j+1;
```

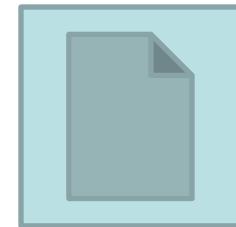
Lazy-CSeq sequentialization

Formula encoding:
goto statement to formula
add a guard for each crossing
control-flow edge
= **O(M) guards**



```
#define J(j)
if (j<pci || j>=nextCS) goto j+1;
```


(lazy-cseq-example.pdf)



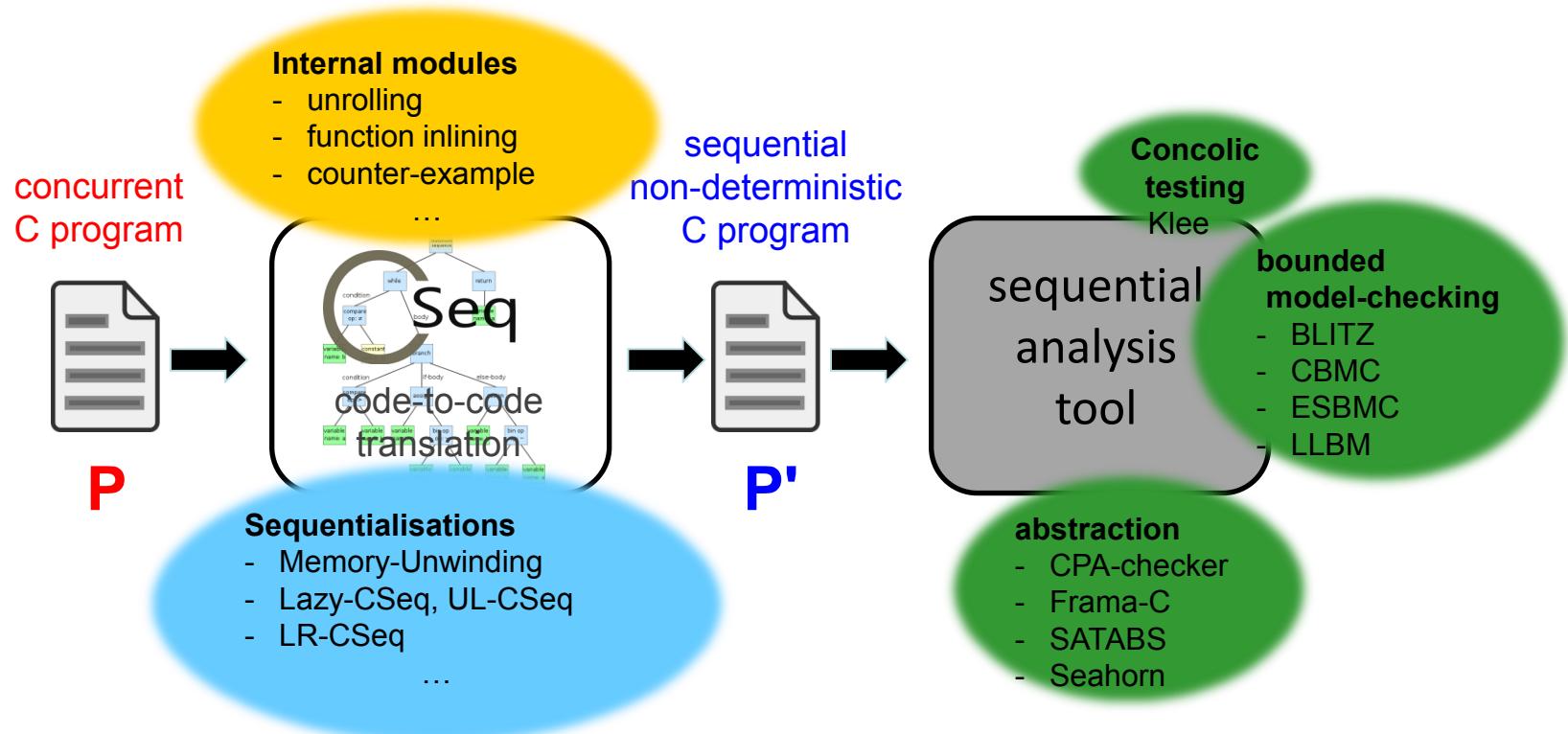
Lazy-CSeq tool



[Inverso-Nguyen-Fischer-La Torre-Parlato, ASE'15]

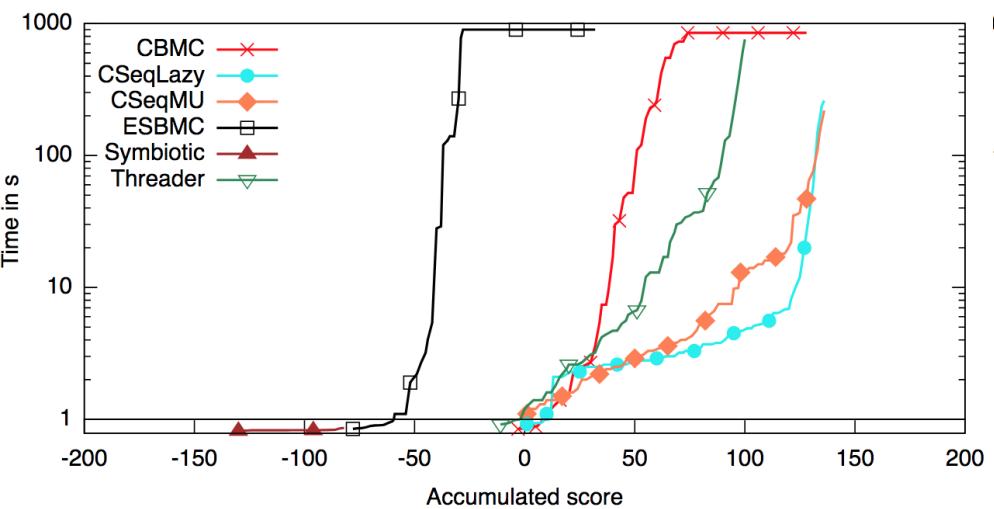
CSeq is a framework that simplifies code-to-code translations

- for C programs + Pthread
- comprises several code-to-code translation modules
- supports several sequential analysis back-end tools

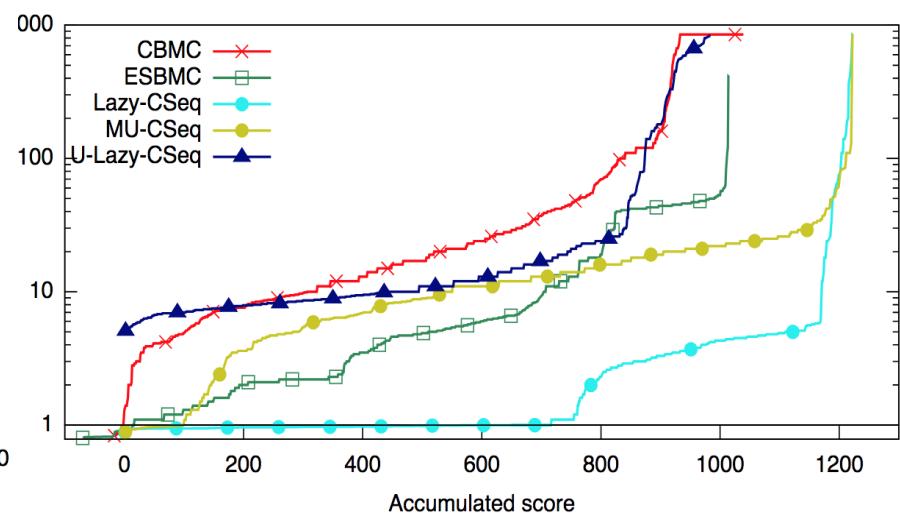


SV-COMP concurrency (2014-17)

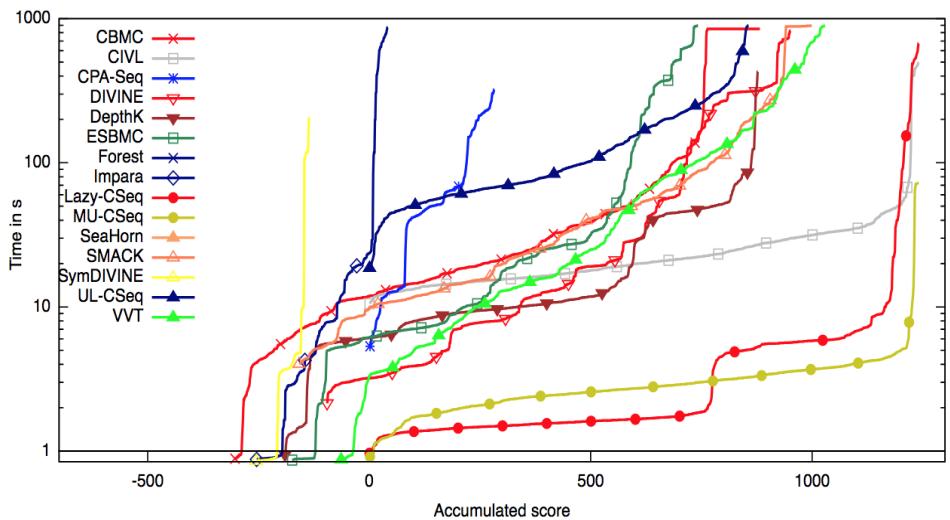
2014



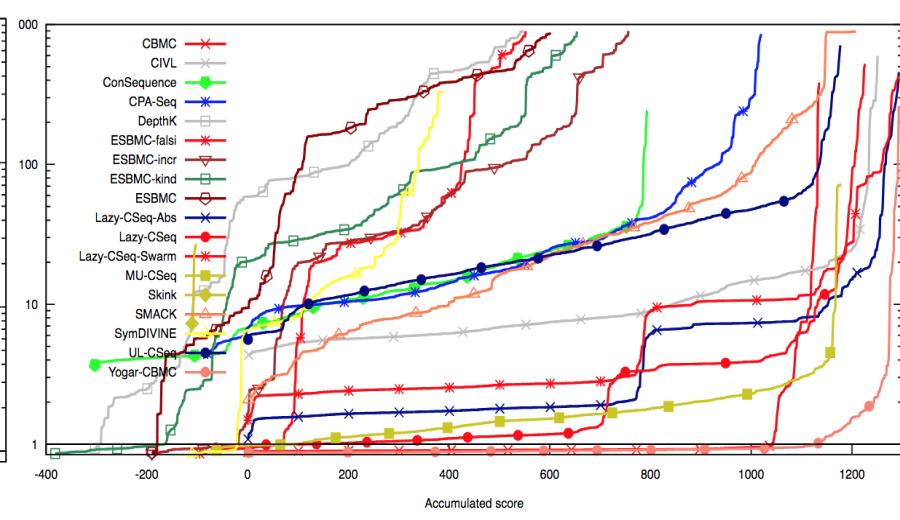
2015



2016



2017



Experiments on lock-free data structures (hard benchmarks)

Safestack

[Concurrency Testing Using Controlled Schedulers: An Empirical Study, Thomson, Donaldson, Betts, PPoPP'14, TOPC'16]

- ABA problem: requires context bound of 5 for exposure
- **Lazy-CSeq** can find bug in **~7h** and **6.5GB**
 - ▷ #unwind=3, #rounds=4, #threads=4, size=152 visible stmts
- **all other tools fail**

Eliminationstack

[Bouajjani, Emmi, Enea, Hamza--POPL'15]

- ABA problem: requires 7 threads for exposure
- **Lazy-CSeq** can find bug in **~13h** and **4GB**
 - ▷ #unwind=1, #rounds=2, #threads=8, size=52 visible stmts
- **all other tools fail**

State of affairs

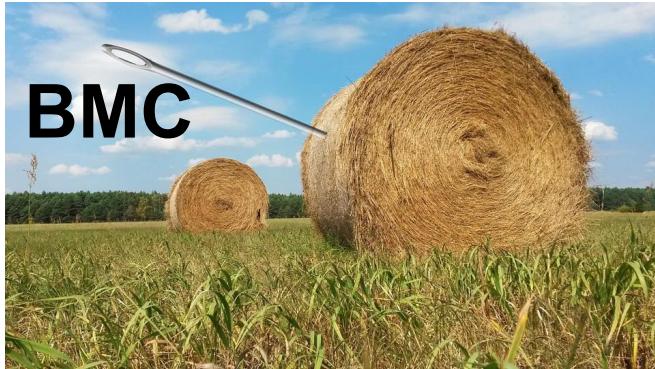


Testing

[Nguyen –Schrammel–Fischer–La Torre–Parlato, ASE'17]

VERISMART

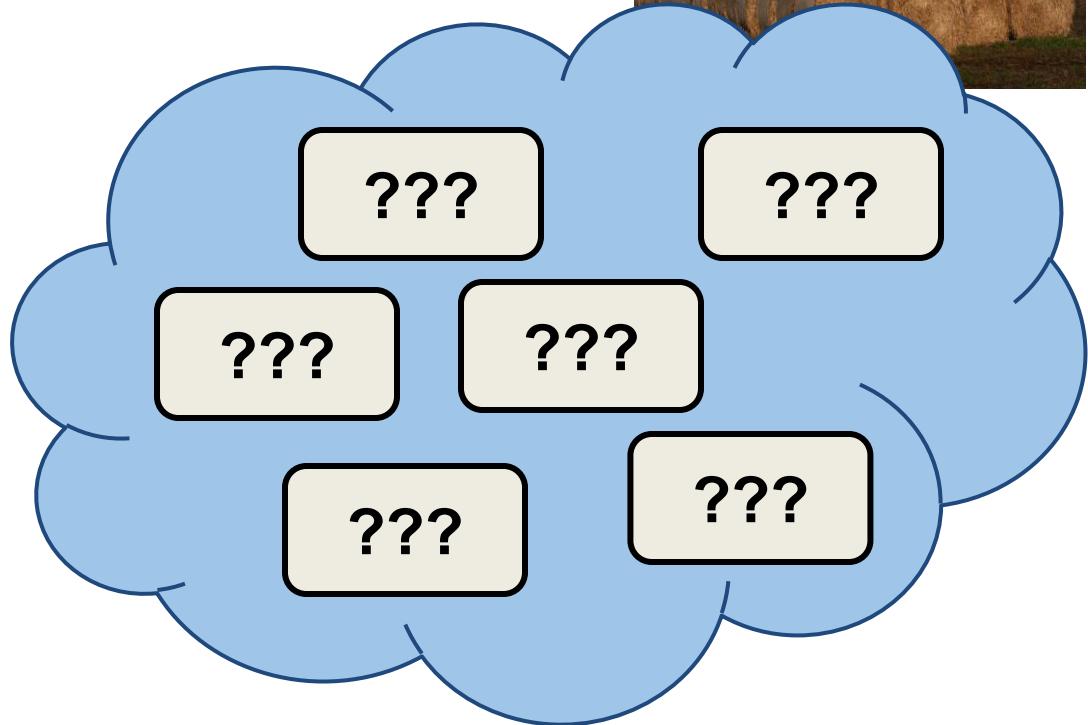
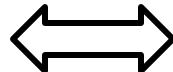
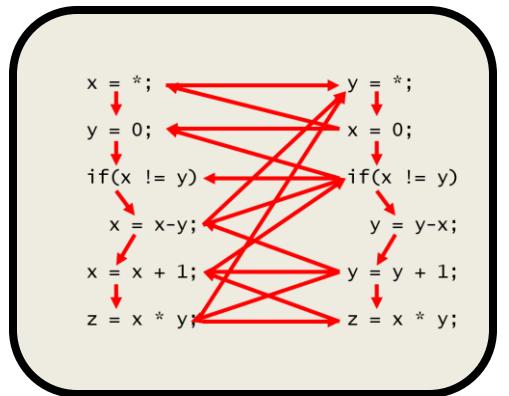
Intuition



Testing



How can we get the bales?

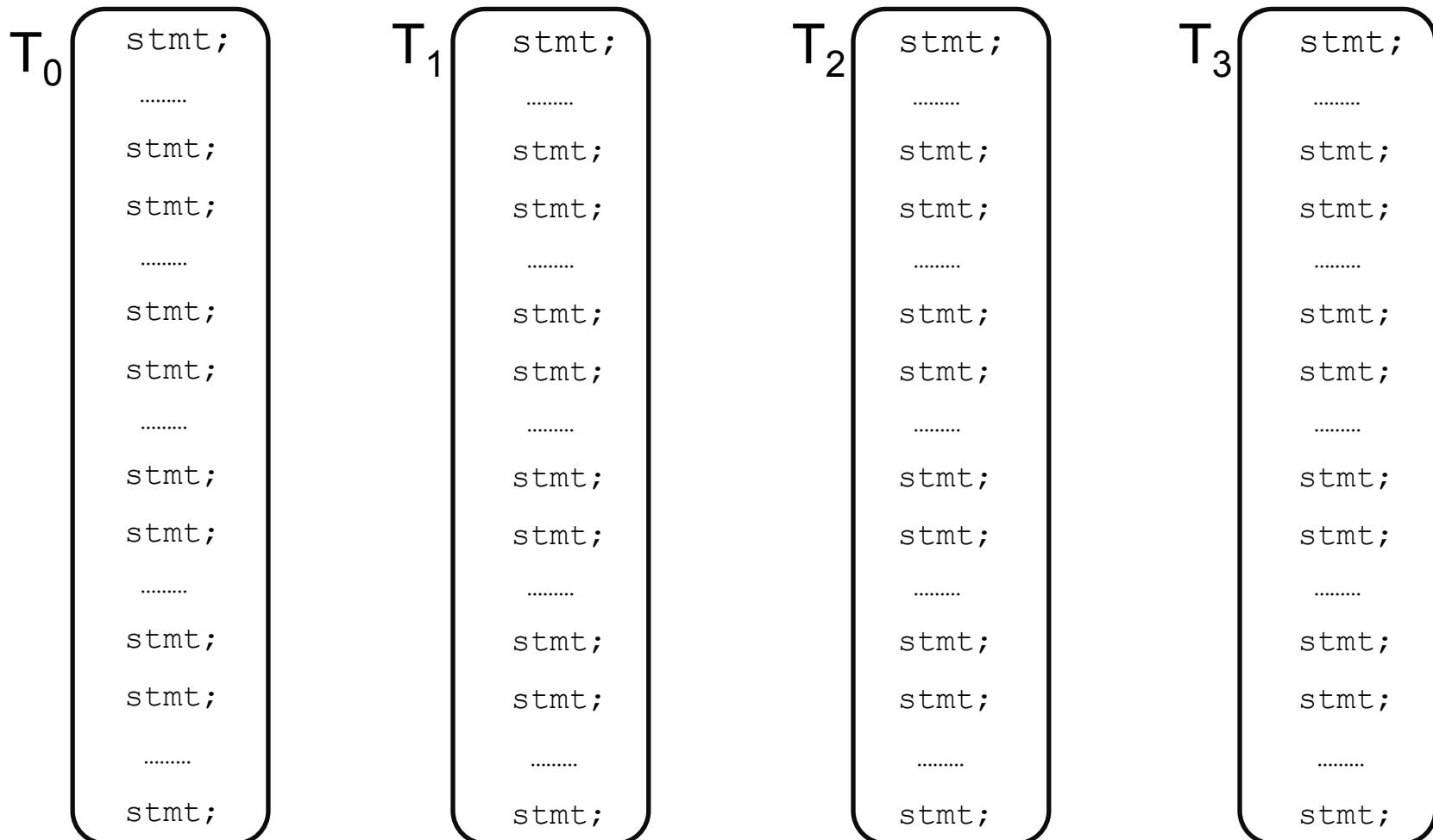


How can we partition a task into **independent smaller** tasks?

Tiling threads

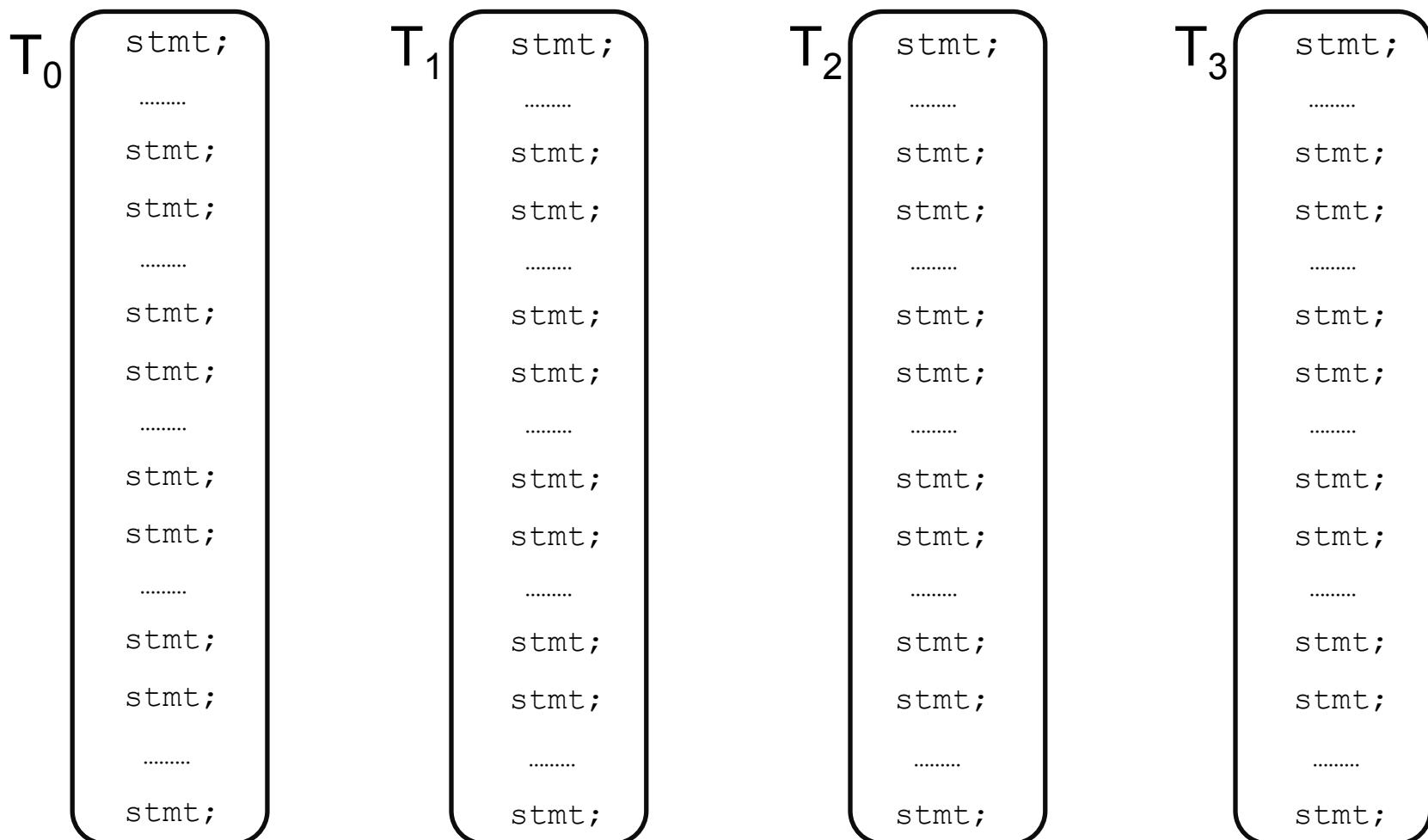
Assumption: bounded concurrent programs

- control can only go forward
- same # of stmts, e.g. 1000



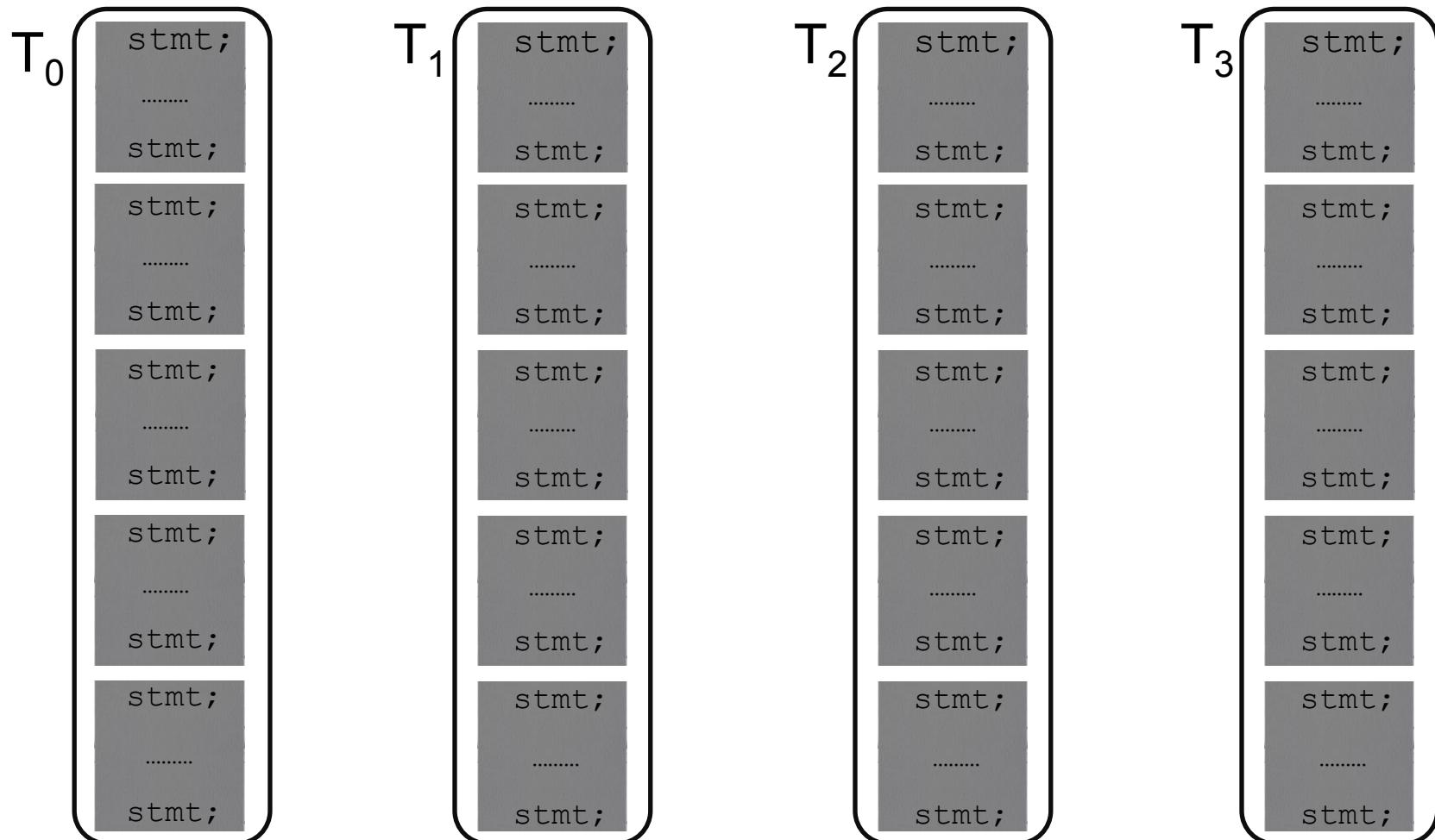
Tiling threads

Tasks as variants of the original program by splitting the code of each thread into fragments (tiles) and allowing context-switches only in some of them



Tiling threads

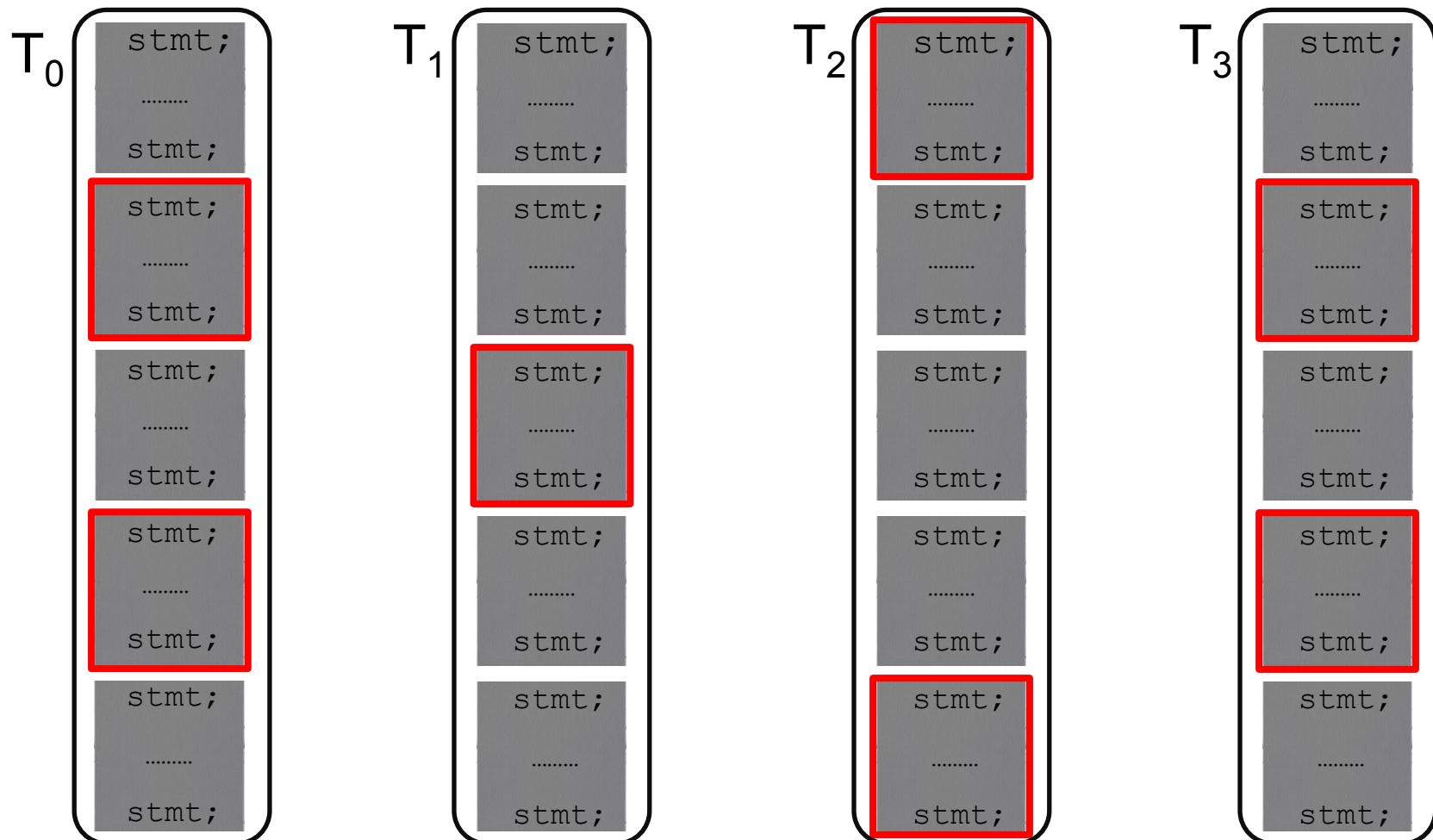
- **tile**: (contiguous) subset of visible statements
- **tiling**: partition of program into tiles
- **uniform window tiling**: all tiles have same size



Tiling threads

Observation: For a k -round execution at most k tiles per thread are involved in context-switching!

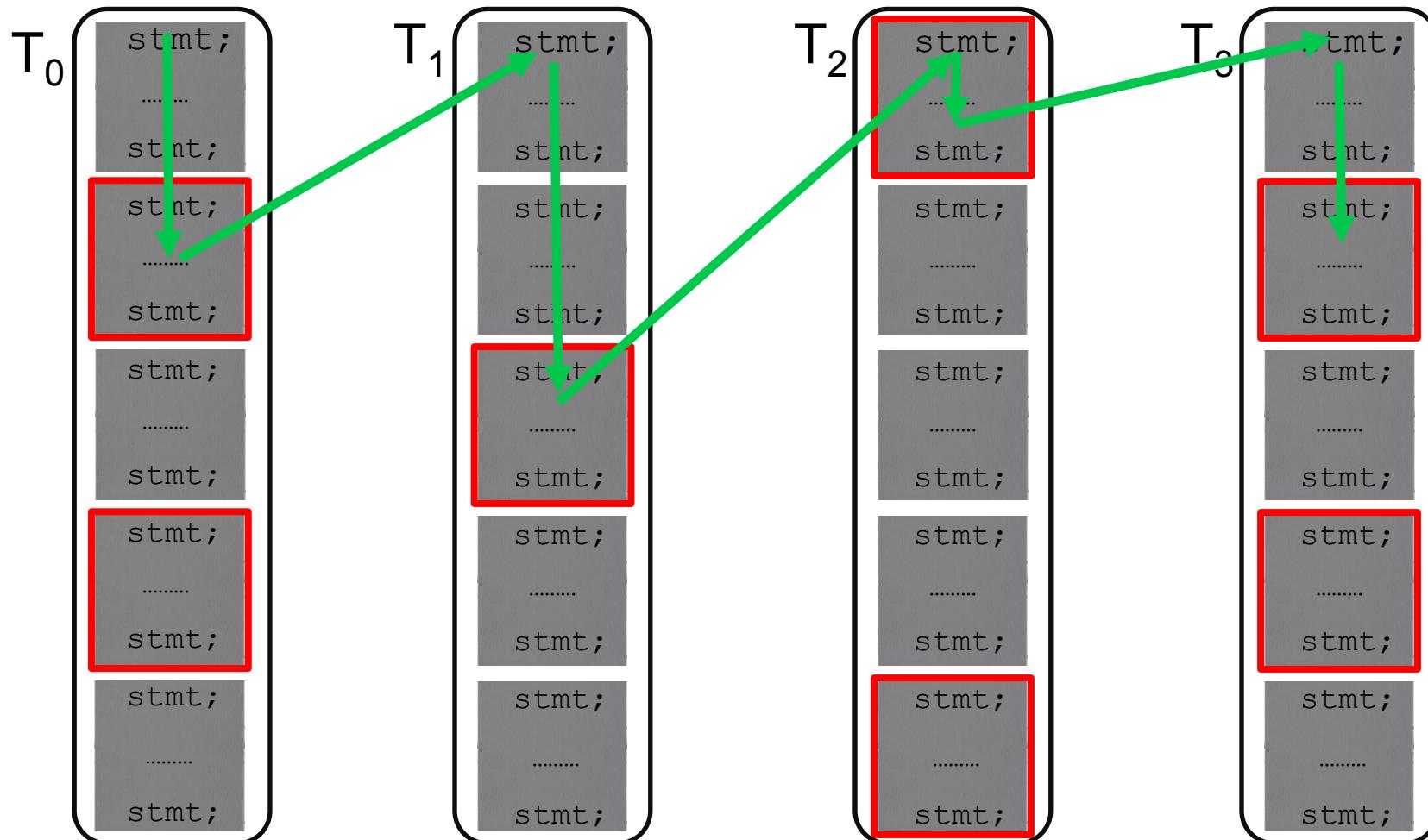
Example: $k=2$



Tiling threads

Observation: For a k -round execution at most k tiles per thread are involved in context-switching!

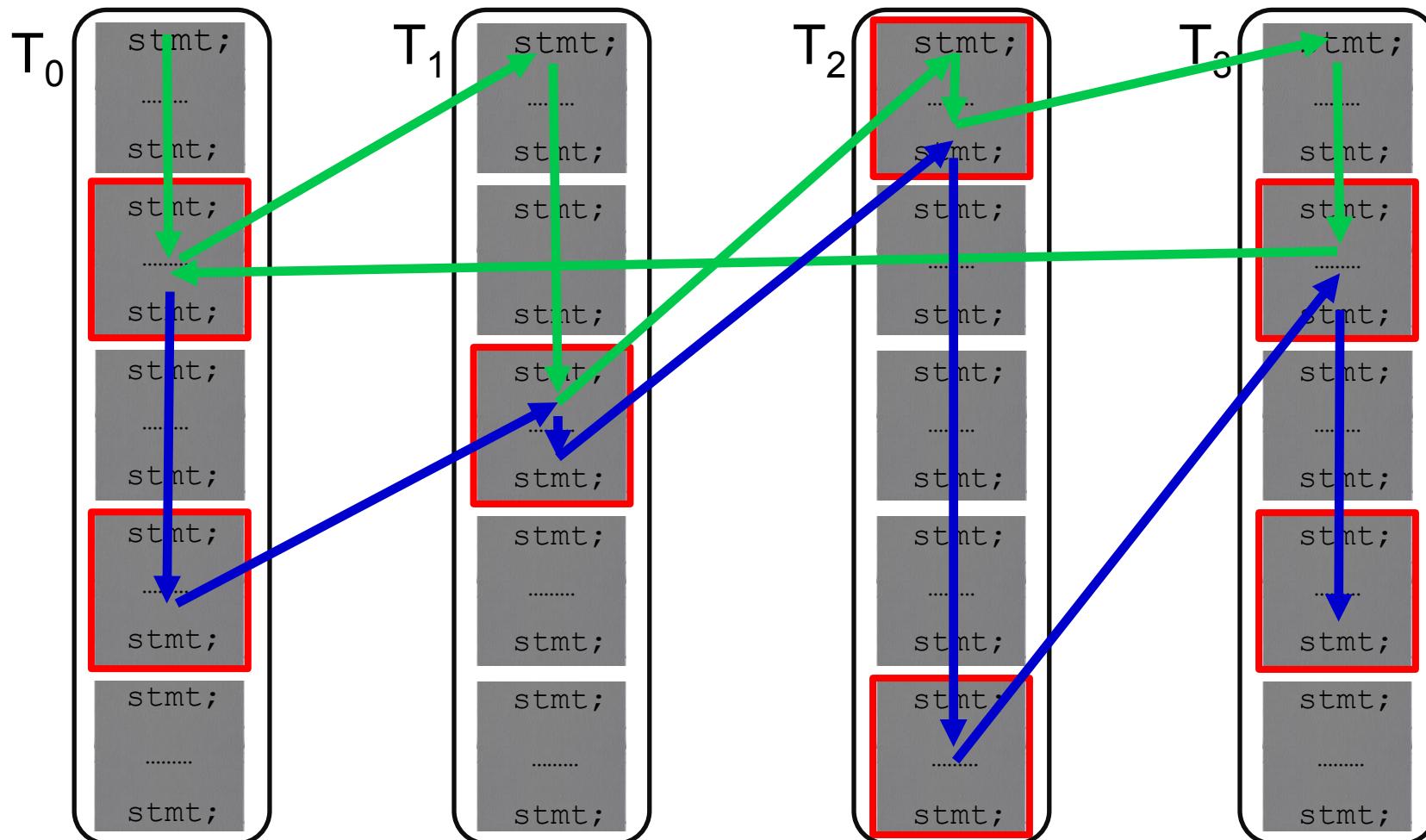
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Tiling threads

Observation: For a k -round execution at most k tiles per thread are involved in context-switching!

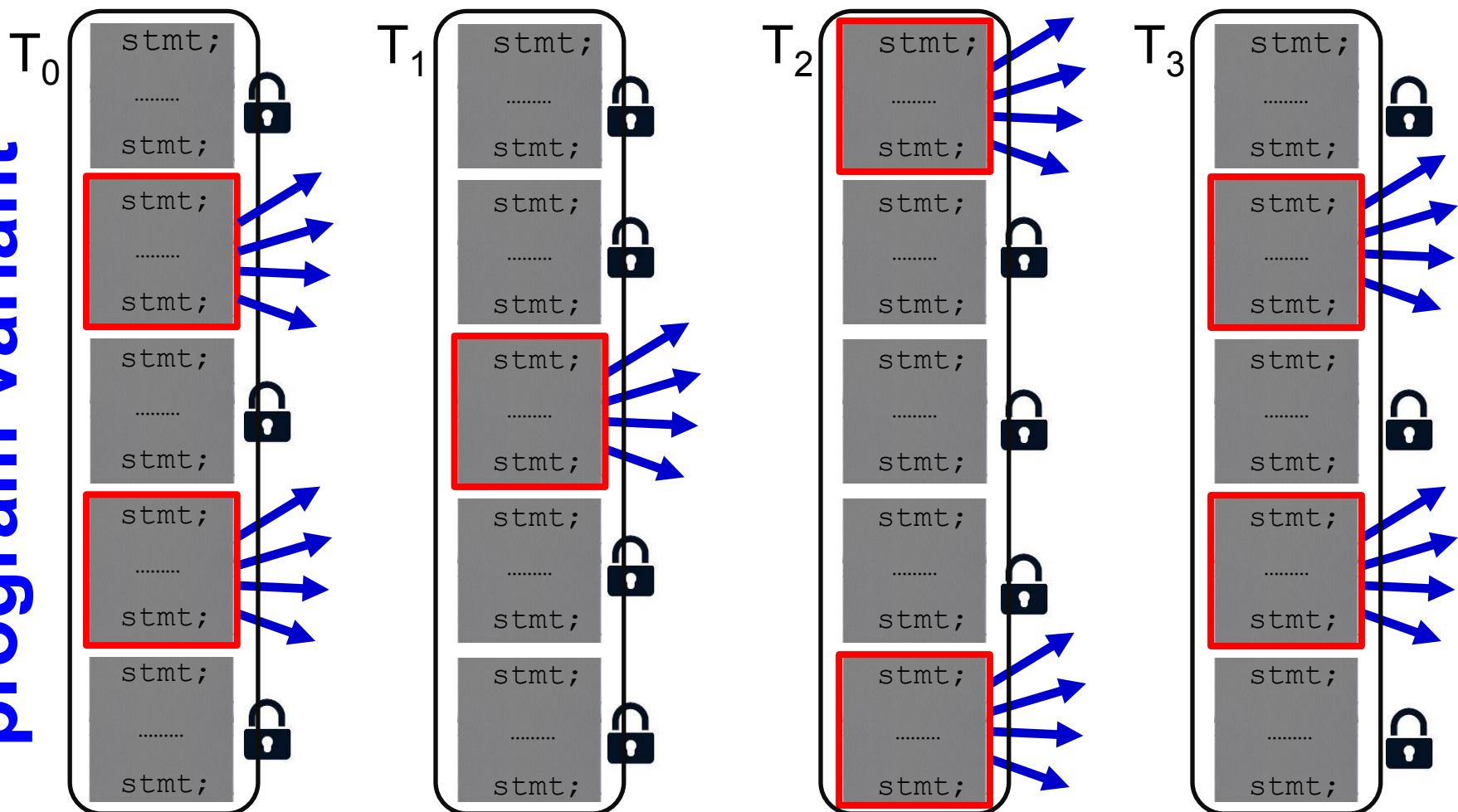
Example: $k=2$



***k*-selections & program variants**

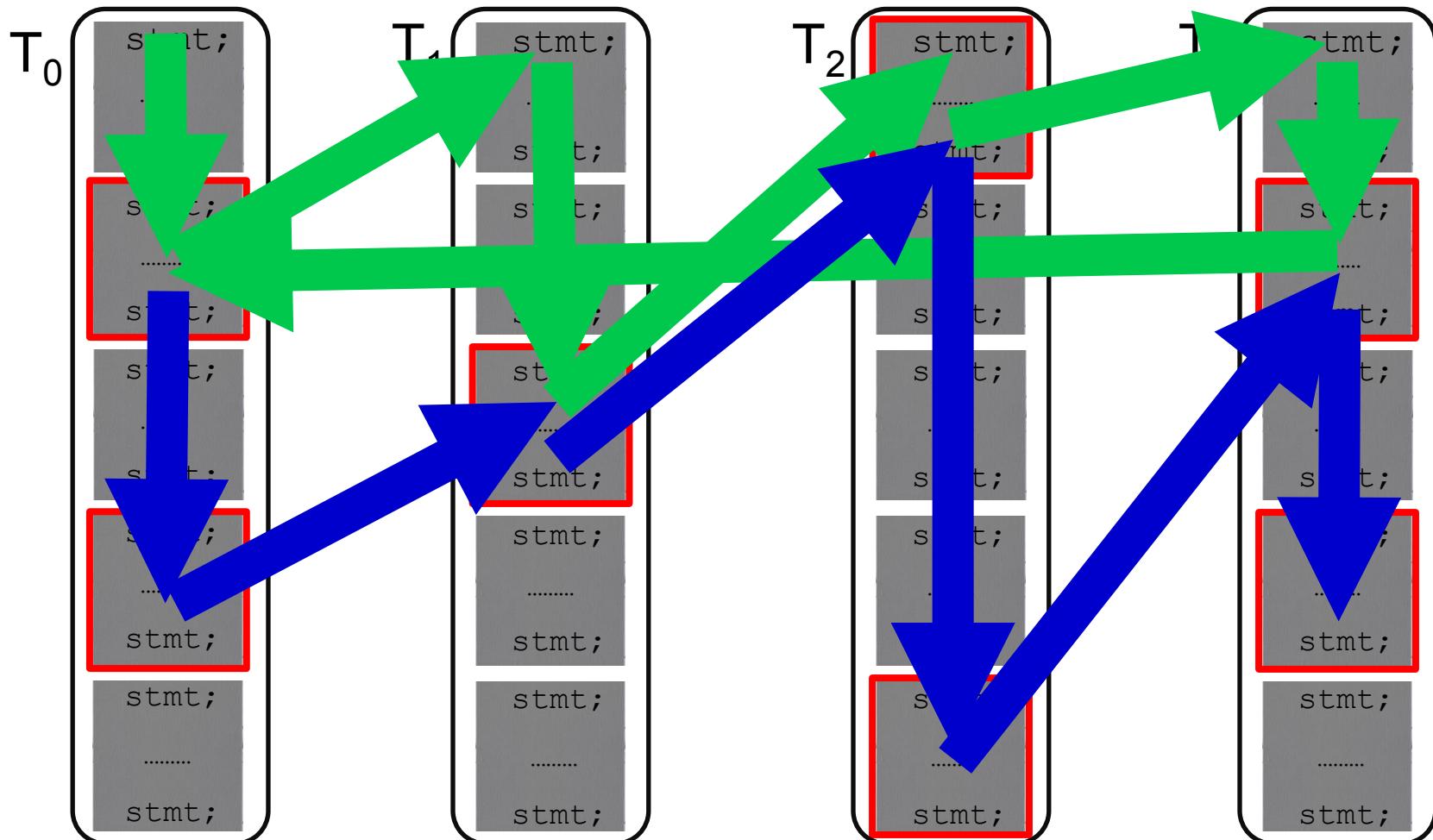
- ***k*-selection**: subset of k tiles for each thread
 - **context switches** are **only** allowed from **selected tiles**
- each k -selection specifies a **reduced interleaving instance**

program variant

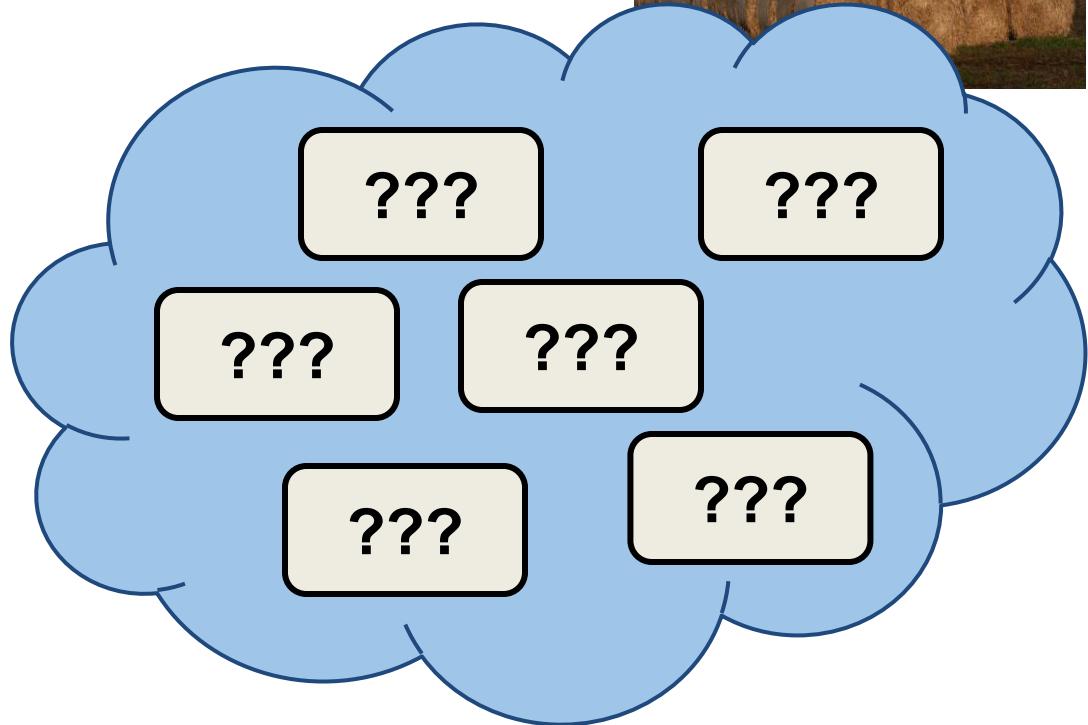
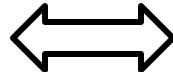
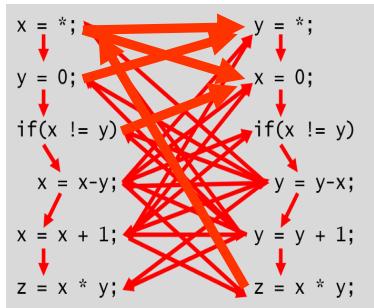


Tiling threads

- ***k*-selection**: subset of *k* tiles for each thread
 - **context switches** are **only** allowed from **selected tiles**
- each *k*-selection specifies a **reduced interleaving instance**

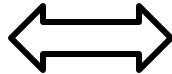
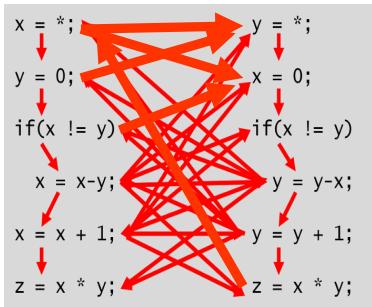


How can we get the bales?



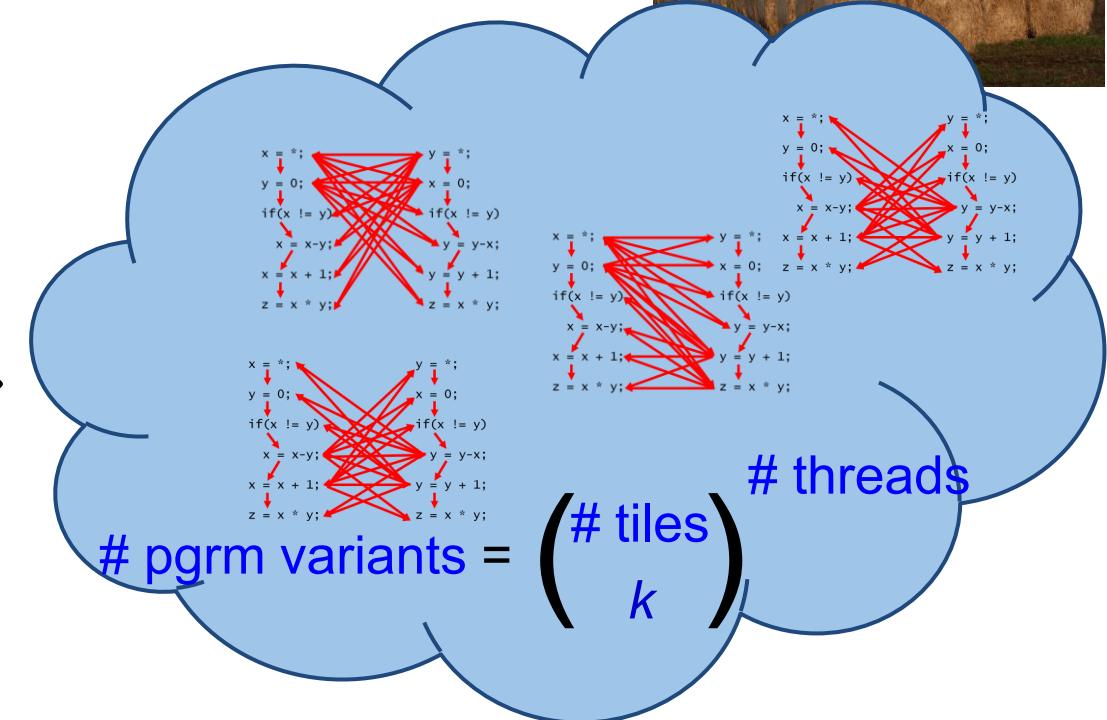
How can we partition a task into **independent smaller** tasks?

How can we get the bales?

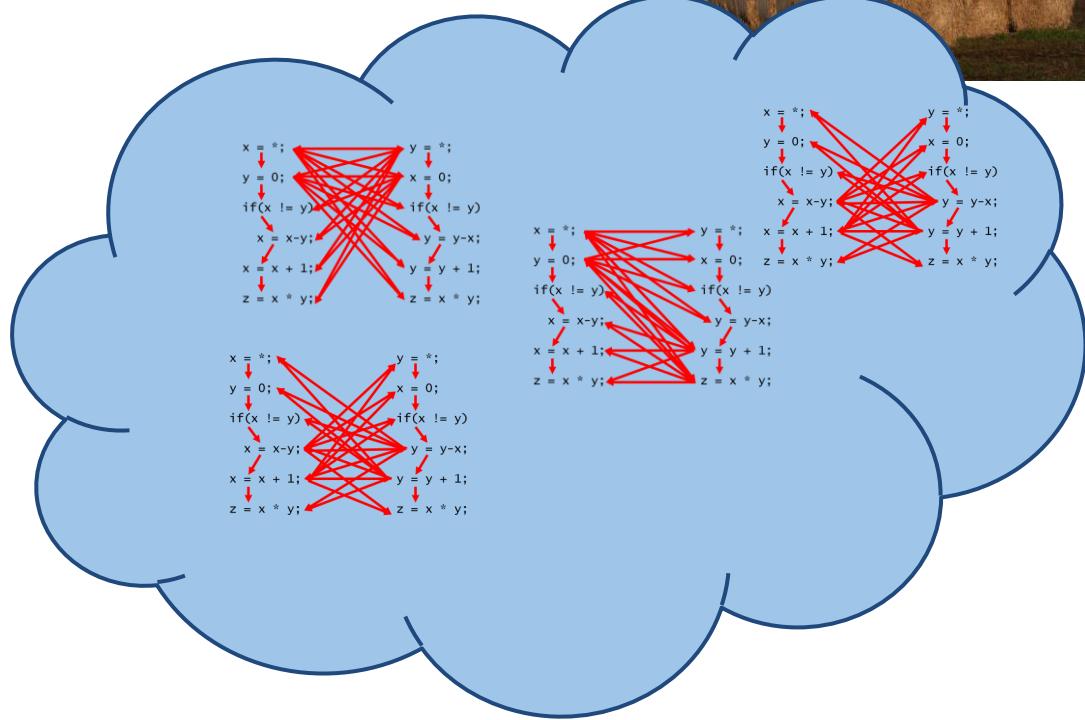
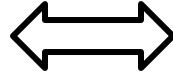
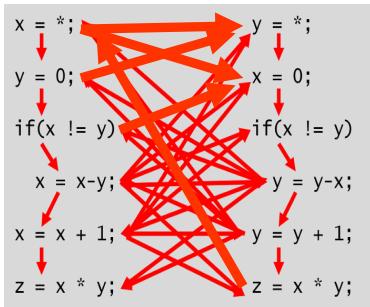


Answer:

- fix a tiling and k
- generate the program variants for all k -selections



How can we get the bales?



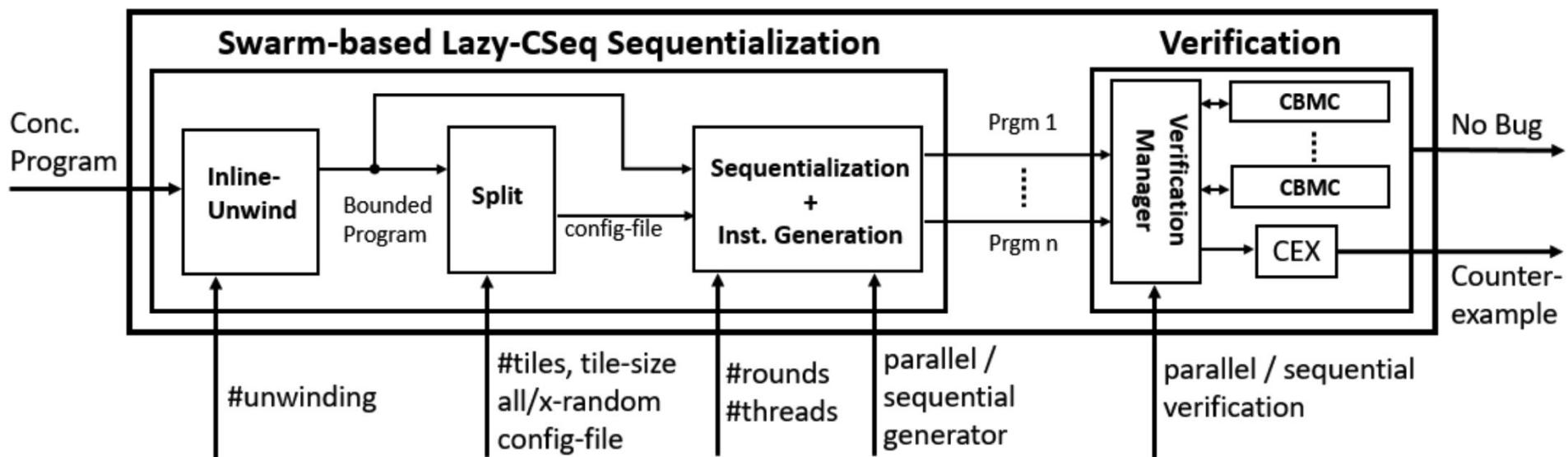
Answer:

- fix a tiling
- generate the program variants for all k -selections

Why does this work?

- each prgm variant captures a subset of k -round executions of P
- each execution is captured by a prgm variant

VERISMART architecture



Eliminationstack: results

Eliminationstack

- ABA problem: requires 7 threads for exposure
- Lazy-CSeq can find bug in **~13h** and **4GB**
 - #unwind=1, #rounds=2, #threads=8, size=52 visible stmts
 - each experiment: 8,000 instances chosen randomly

ERISMART: 2 tiles		
#1: tile size 12, t_max 1.5hrs		
Verification	Time	Memory
Min	34.9	945.2
Max	4753.6	1199.1
Average	1116.3	1017.8

instances with bug: 38.22%

#2: tile size 14, t_max 2.5hrs		
Verification	Time	Memory
Min	39.7	979.84
Max	7195.2	1281.3

instances with bug: 61.38%

#3: tile size 18, t_max 3hrs		
Verification	Time	Memory
Min	37.1	999.8
Max	10762.0	1785.5

instances with bug: 69.01%

fastest instances
very fast – 1000x

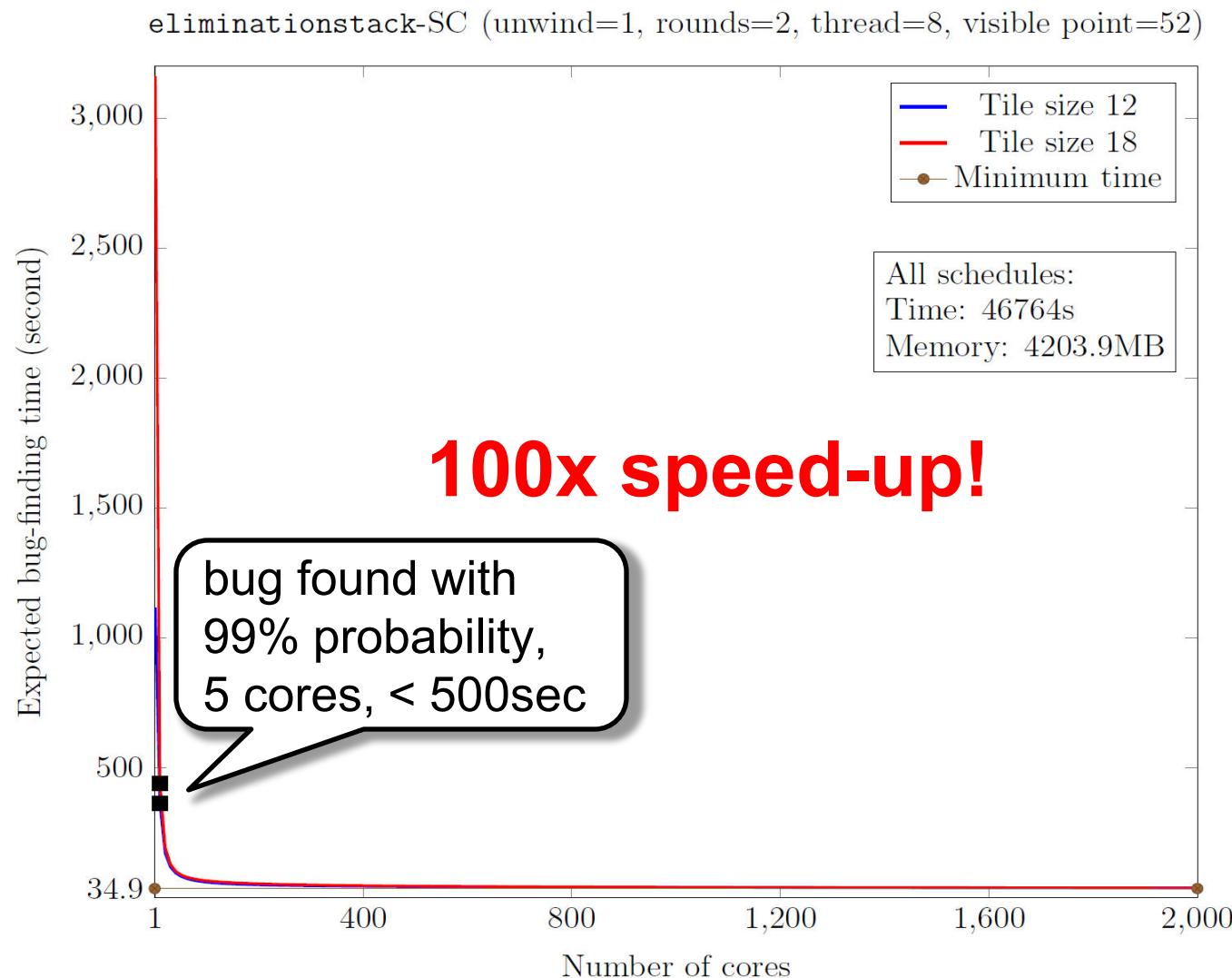
reduced memory
consumption – 4x

average still very
fast – 40x

high fraction of bug-
exposing instances

some slowdown for
larger tile sizes – 10x

Eliminationstack: expected bug-finding time



Safestack: experiments

Safestack

- ABA problem: requires context bound of 5 for exposure
- **Lazy-CSeq** can find bug in **~7h and 6.5GB**
 - ▷ #unwind=3, #rounds=4, #threads=4, size=152 visible stmts

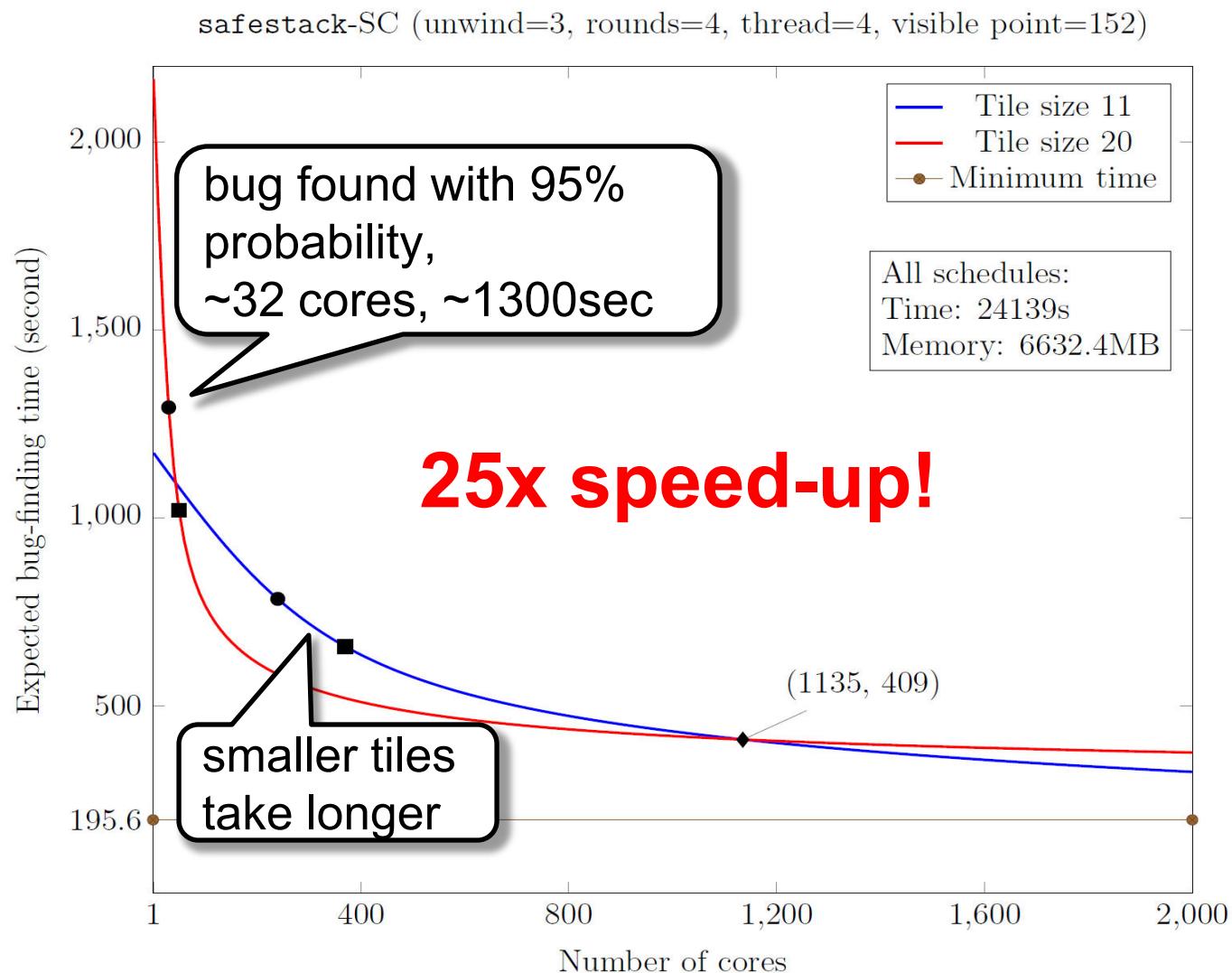
VERISMART: 4 tiles per thread

#1: tile size 11, t_max 1hr			#2: tile size 14, t_max 1hr			#3: tile size 20, t_max 4hrs		
Verification	Time	Memory	Verification	Time	Memory	Verification	Time	Memory
Min	195.6	774.5	Min	574.8	846.6	Min	313.0	850.3
Max	2662.6	1265.7	Max	3521.8	1450.4	Max	10315.8	3830.8
Average	1172.2	928.8	Average	1851.1	1147.3	Average	2167.5	1230.1
instances with bug: 1.26%			instances with bug: 2.14%			instances with bug: 10.20%		

lower fraction of bug-exposing instances than eliminationstack

...but boosted with larger tile sizes

Safestack: expected bug-finding time



Conclusions

Testing



VERISMART



Lazy-CSeq
BMC: fully symbolic



PROBABILITY

PERFORMANCE

Current & Future Work

- Fast over-approximations to filter out safe instances
 - abstract interpretation based on BMC?
- BBD-based analysis + VERISMART
 - Safestack: bug found < 1 min
- Weak Memory Models
 - Efficient encoding / Lazy-CSeq
 - ▷ Memory shadowing
 - VERISMART

People

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Thank You



users.ecs.soton.ac.uk/gp4/cseq