

# Resource-Parameterized Program Analysis Using Observation Sequences

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Ph.D. Proposal

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# Outline

- **Research Problem**
- Observation Sequences Formally
- Application: Context-UnBounded Analysis
- More Applications (Further Work)
- Conclusion and Schedule

## Resource-parameterized programs are ubiquitous

Applications	Resources
Web-servers	threads, message channels
GUI	event queues, threads
Modeling complex systems	computational nodes

# Programs must be safe for any number of resources

Examples of desired properties:

- free of **data race / race condition** in shared-memory multi-threaded programs
- **responsiveness** in message-passing programs
- **deadlock-free** or **mutual exclusion** in distributed systems

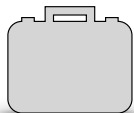
# Analysis of resource-parameterized programs is challenging



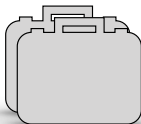
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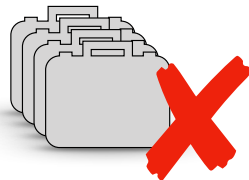
# A natural and tested solution: resource-bounded analysis



start with **one** resource



iteratively increase resource



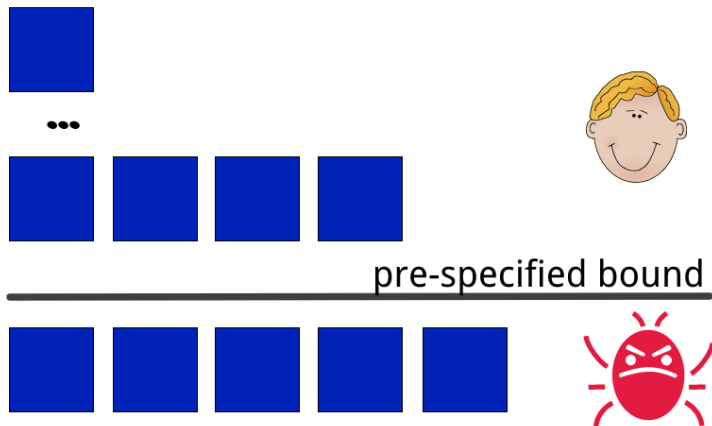
until a violation is found



until a **pre-specified** upper bound

Most bugs can be exposed with a  
**small** number of resources [ASPLOS'08]

# Still, there might be bugs **beyond** the pre-specified bound



Can we guarantee **unconditional** safety?

# Resource-unbounded analysis ensures safety

## Goal

To provide a resource-unbounded analysis for safety verification.

## Approach

To lift the resource-bounded bug-finding technique.



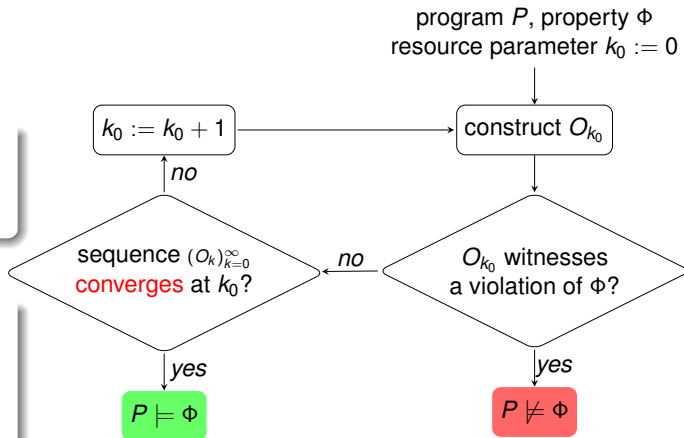
# Get rid of pre-specified bound via tracking program behaviour

Informally,  
**observation sequence (OS)** is

a sequence of **program behaviors**  $O_k$  observed within  $k$  instances of resource.

## Examples

- 👉  $O_k := \{ \text{reachable program states within } k \text{ threads} \}$
- 👉  $O_k := \{ \text{reachable memory locations within } k \text{ threads} \}$
- 👉 ...



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## OS-based analysis has to be decidable

An **observation sequence** is a sequence  $(O_k)_{k=0}^{\infty}$  with the following properties:

- $\forall k: O_k \subseteq O_{k+1}$  — **monotonicity**;
- $\forall k: O_k$  is **computable**;
- $\forall k: O_k \models \Phi$  is **decidable**, where  $\Phi$  is a property of interest.

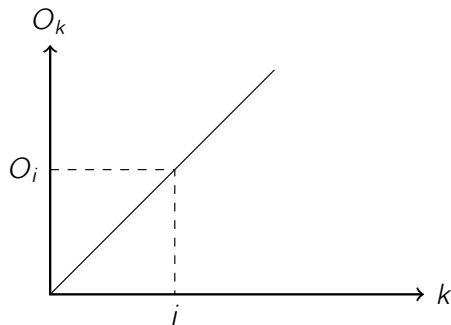
### Problem

How to make  $(O_k)_{k=0}^{\infty}$  **converge**?

## Abstraction of OS converges

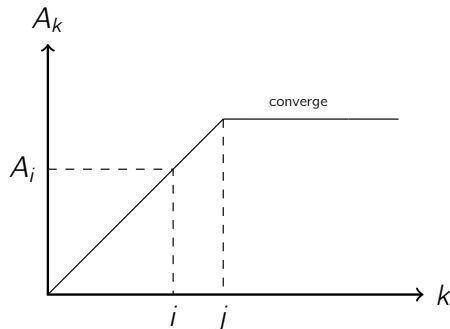
An OS  $(O_k)_{k=0}^{\infty}$  over a **finite** domain always converges.

*Divergence*



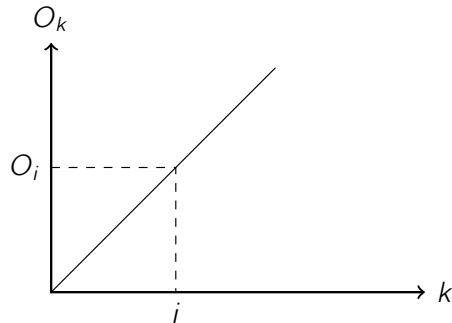
*abstraction* →

*Convergence*

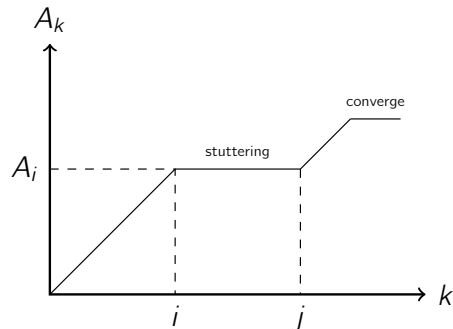


$$A_k := \text{abstraction}(O_k)$$

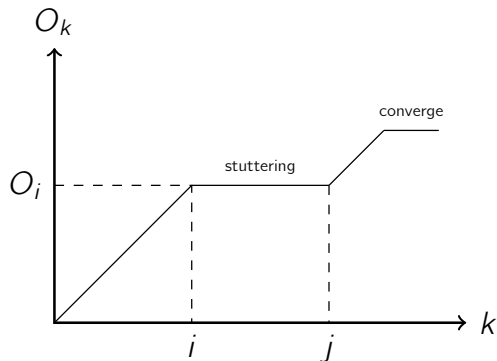
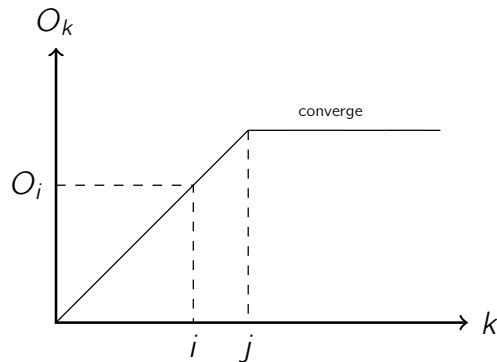
# Abstraction of OS might stutter before converging

**Divergence**

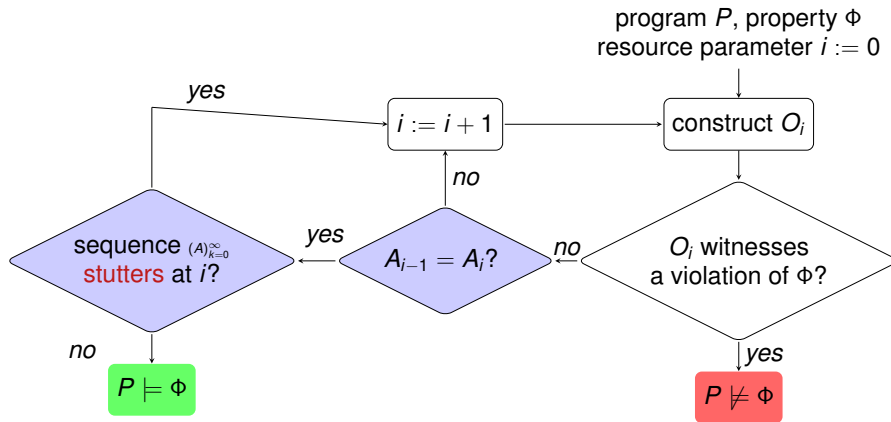
*abstraction* →

**Stuttering**

# We need to distinguish stuttering from converging

**Stuttering****Stutter-free**

# Abstraction converges and survives stuttering!



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# Context-UnBounded Analysis (CUBA)

## Target is:

shared-memory multi-threaded **recursive** programs.

## Resource is:

the number of **contexts** in the executions.

## Observation is:

the set of **reachable** program states w.r.t.  $k$  contexts.

## Analysis is:

to check the reachability of **bad** states.

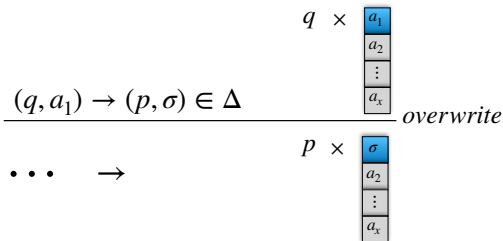
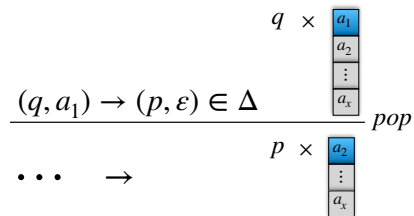
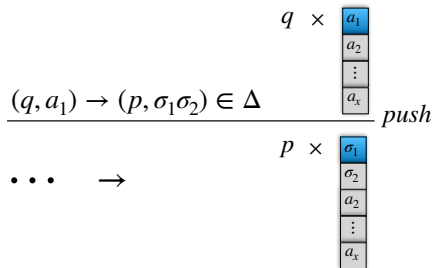
# CPDS can be used to abstract program states

## Concurrent Pushdown System (CPDS)

A CPDS  $P^n$  is a collection of  $n$  PDS  $P_i = (Q, \Sigma_i, \Delta_i, q^i)$ ,  $1 \leq i \leq n$ , where

- $Q$  is a finite set of **shared** states;
- $\Sigma_i$  is a finite set of **local** states;
- $\Delta_i \subseteq (Q \times \Sigma_i^{\leq 1}) \times (Q \times \Sigma_i^{\leq 2})$ ,  $\Sigma_i^{\leq 1} = \Sigma_i \cup \{\varepsilon\}$  and  $\Sigma_i^{\leq 2} = \{\omega \in \Sigma_i^* \mid |\omega| \leq 2\}$ ;
- $q^i \in Q$  is the initial shared state.

# CPDS states change on push, pop, overwrite



# Program executions are represented with contexts

Thread A :  $\underbrace{\circ \rightarrow \dots \rightarrow \circ \rightarrow}_{\text{context}}$

Thread B :

$\underbrace{\circ \rightarrow \dots \rightarrow \circ \rightarrow}_{\text{context}}$

Thread C :

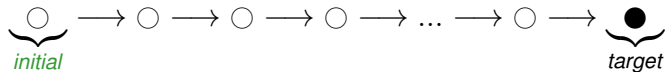
$\underbrace{\circ \rightarrow \dots \rightarrow \circ \rightarrow}_{\text{context}}$

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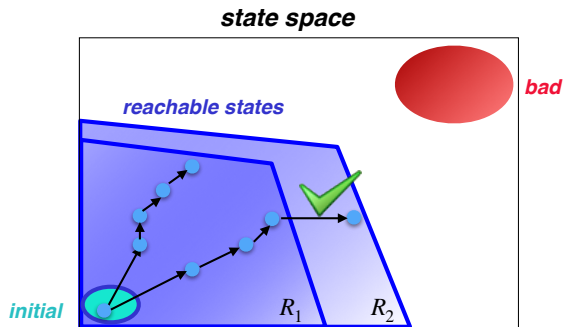
Resources are **contexts**

# Reachable states must not be bad

A state is **reachable** if



**Safety as reachability**



# Infinite observations can be reduced to decidable

- **Observation**  $R_k$  – the set of states reachable within  $k$  contexts.
- $R_k$  can be **infinite** [CAV'00], and reachability of CPDS is **undecidable** [TOPLAS'00].

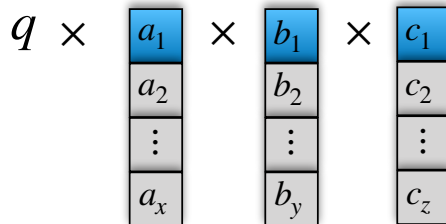
## [TACAS'05]

- $R_k$  can be **finitely** represented.
- Context-**bounded** reachability of CPDS is **decidable**.

# We can apply CUBA to sequences of global states

## Global state

A **global state**  $R$  of a CPDS is an element of  $Q \times \Sigma_1^* \times \dots \times \Sigma_n^*$ , written in angle brackets:  
 $\langle q | \omega_1, \dots, \omega_n \rangle$ .



$(R_k)_{k=0}^\infty$  is defined over an **infinite** domain and **stutter-free** [PLDI'18].

# An example: observation sequences might diverge

Shared states:

$$Q = \{0, 1, 2, 3\}$$

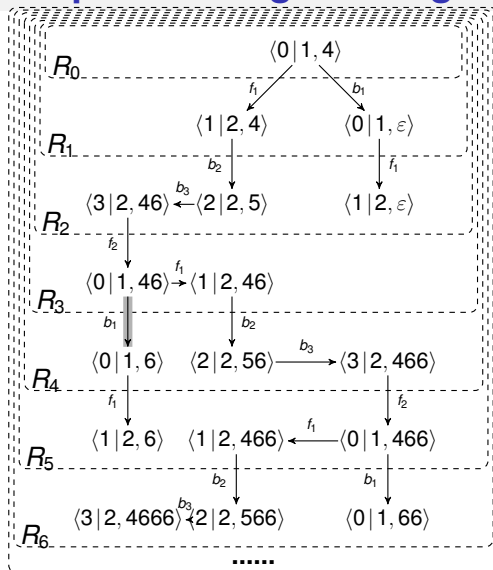
Thread 1:

$$\begin{aligned}\Sigma_1 &= \{1, 2\} \\ \Delta_1 &= \{f_1 : (0, 1) \rightarrow (1, 2), \\ &\quad f_2 : (3, 2) \rightarrow (0, 1)\}\end{aligned}$$

Thread 2:

$$\begin{aligned}\Sigma_2 &= \{4, 5, 6\} \\ \Delta_2 &= \{b_1 : (0, 4) \rightarrow (0, \varepsilon), \\ &\quad b_2 : (1, 4) \rightarrow (2, 5), \\ &\quad b_3 : (2, 5) \rightarrow (3, 46)\}\end{aligned}$$

$$q' = 0$$





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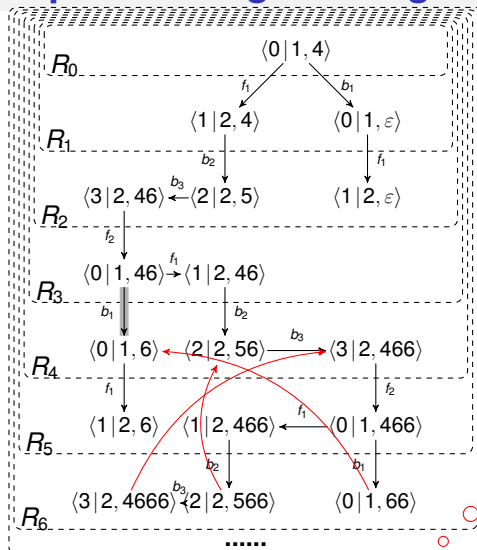
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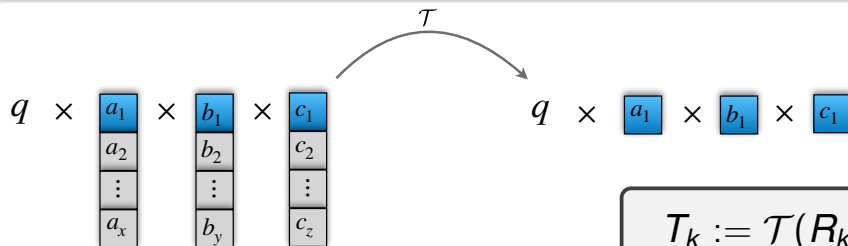
$$\begin{aligned} \Sigma_2 &= \{4, 5, 6\} \\ \Delta_2 &= \{ b_1 : (0, 4) \rightarrow (0, \varepsilon), \\ &\quad b_2 : (1, 4) \rightarrow (2, 5), \\ &\quad b_3 : (2, 5) \rightarrow (3, 46) \} \end{aligned}$$

$$q^I = 0$$



## Solution: replace *global state* with *visible state*

Project global states to a **finite** domain by cutting off tails of stacks: obtain **visible states**  $T_i$ .



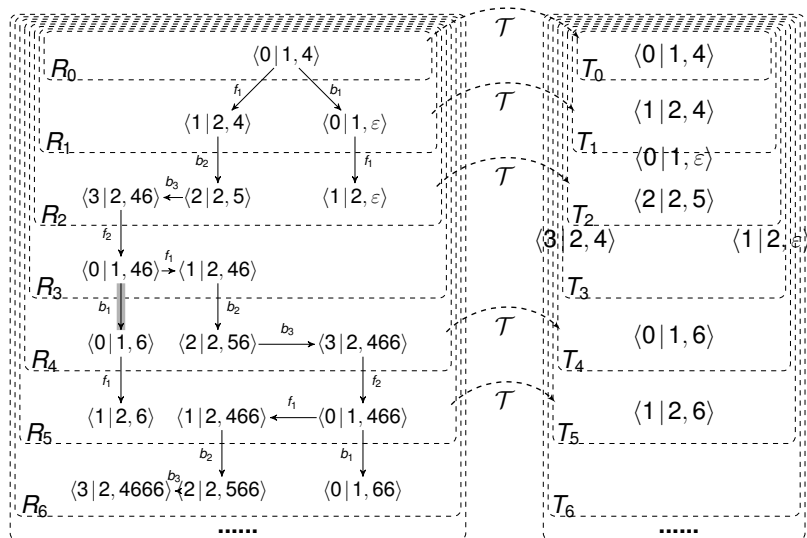
$$T_k := \mathcal{T}(R_k)$$

## Visible states

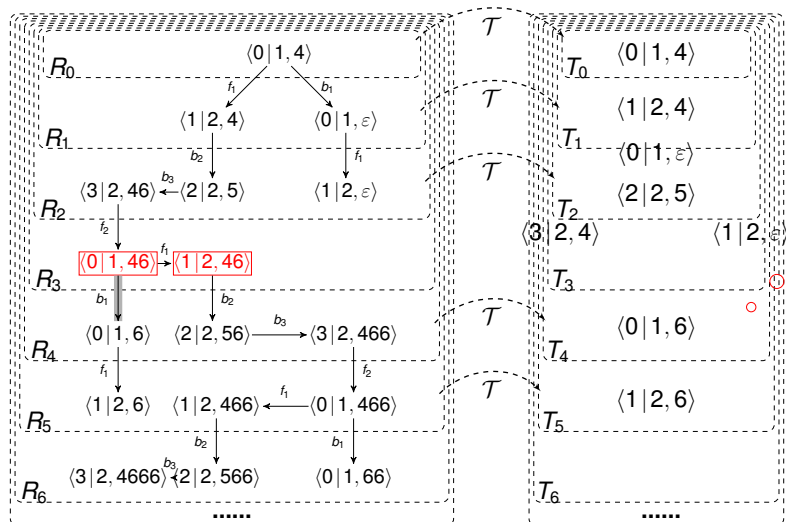
☞ suffice to express many safety properties, e.g. various assertions, data race, race condition, etc.

☞  $(T_k)_{k=0}^{\infty}$  is guaranteed to **converge**.

# Do visible states help in the example?



# The problem is stuttering



# We can use observation on generators

Shared states:

$$Q = \{0, 1, 2, 3\}$$

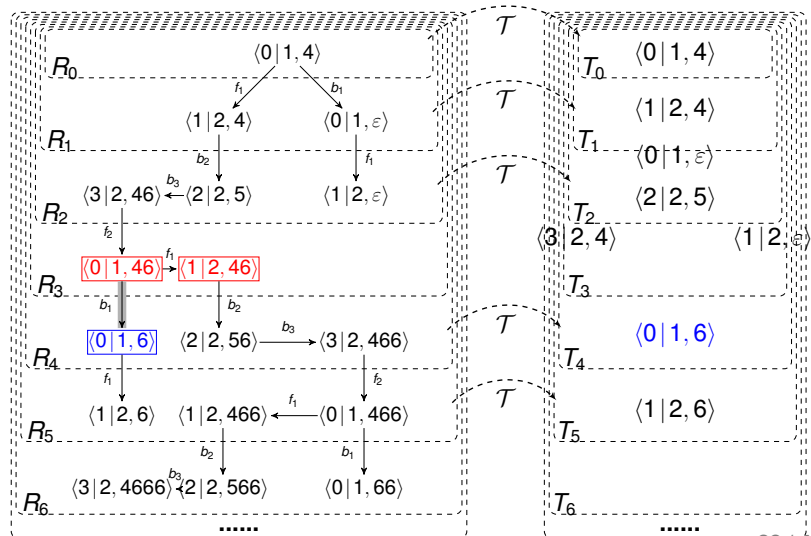
Thread 1:

$$\begin{aligned} \Sigma_1 &= \{1, 2\} \\ \Delta_1 &= \{f_1 : (0, 1) \rightarrow (1, 2), \\ &\quad f_2 : (3, 2) \rightarrow (0, 1)\} \end{aligned}$$

Thread 2:

$$\begin{aligned} \Sigma_2 &= \{4, 5, 6\} \\ \Delta_2 &= \{b_1 : (0, 4) \rightarrow (0, \varepsilon), \\ &\quad b_2 : (1, 4) \rightarrow (2, 5), \\ &\quad b_3 : (2, 5) \rightarrow (3, 46)\} \end{aligned}$$

$$q^l = 0$$



# Generators can be approximated...

## Properties [PLDI'18]

- 👉 generators are of special form  $\Rightarrow$  can be statically approximated
- 👉 all generators have been reached  $\Rightarrow$  OS converges
- 👉 any overapproximation suffices

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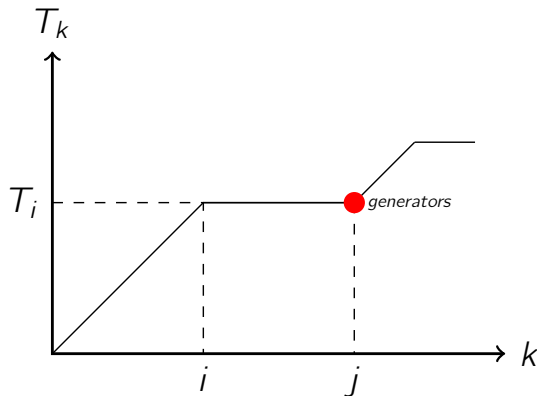
## Properties [PLDI'18]

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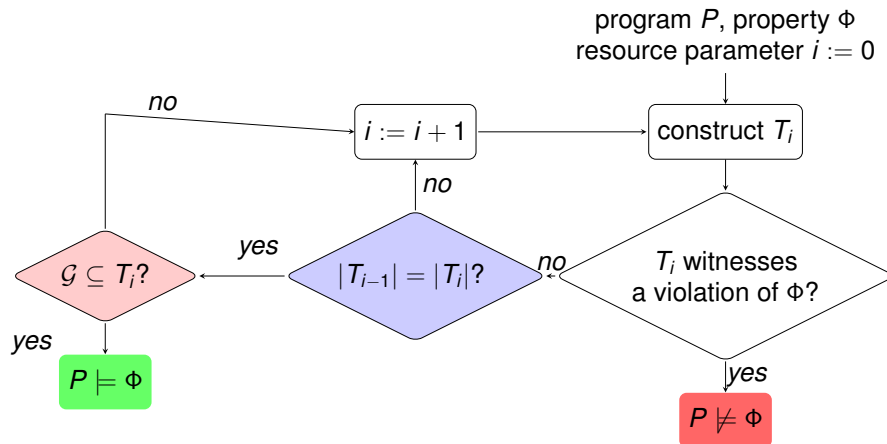
# Generators help detect stuttering

## Stuttering



- 👉 All generators have been reached  
⇒ OS converges

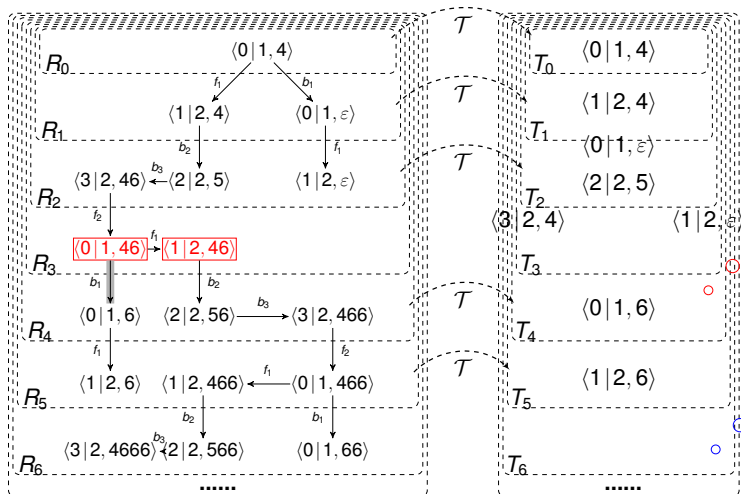
# Algorithm relies on generators



$\mathcal{G} := \{\text{reachable generators}\}$

# Example revisited: convergence achieved

$$\mathcal{G} = \{\langle 0 | 1, \varepsilon \rangle, \langle 0 | 1, 6 \rangle\}$$



*stuttering*

*converge*

# Performance evaluation shows practical bound on $k$

ID/Program	Prog. Features		$(T_k)_{k=0}^{\infty}$	
	Thread	Safe?	$k_{max}$	Time (sec.)
1/BLUETOOTH-1	1 + 1	✗	6 (4)	0.26
	1 + 2	✗	6 (3)	2.32
	2 + 1	✗	7 (4)	12.76
2/BLUETOOTH-2	1 + 1	✗	6 (4)	0.53
	1 + 2	✗	6 (3)	4.39
	2 + 1	✗	7 (4)	14.21
3/BLUETOOTH-3	1 + 1	✓	6	0.47
	1 + 2	✓	6	4.71
	2 + 1	✓	7	14.46

ID/Program	Prog. Features		$(T_k)_{k=0}^{\infty}$	
	Thread	Safe?	$k_{max}$	Time (sec.)
4/BST-INSERT	1 + 1	✓	2	1.17
	2 + 1	✓	3	15.84
	2 + 2	✓	4	45.21
5/FILECRAWLER	1* + 2	✓	6	0.03
6/K-INDUCTION	1 + 1	✓	3	0.23
7/PROC-2	2 + 2*	✓	3	0.52
8/STEFAN-1	2	✓	2	1.01
	4	✓	4	16.36
	8	—	$\geq 8$	—
9/DEKKER	2*	✓	6	0.21

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# Our technique applies to message passing programs

## Step 1: Message queues are challenging:

- 👉 generate **infinite** state space;
- 👉 cause **undecidability** of reachability analysis.

## Step 2: Bounding message queues are easier

Queue-**bounded** reachability analysis of message passing programs is often **decidable**.

## Step 3: Our framework is applicable

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Target	message-passing programs
Resource	the size of <b>message queues</b>
Observation	the set of <b>reachable</b> program states w.r.t. the size of queue within $k$ .
Analysis	to check the reachability of <b>bad</b> states.

---

# Our Plan: Theory and practise together

## First, theory

### Step 1: Define observation sequences

- 👉  $(O_k)_{k=0}^{\infty} := R_0, R_1, R_2, \dots$   
 $\Rightarrow R_k :=$  the set of reachable states when **message queues** are bounded by  $k$ .
- 👉 Problem: projecting  $R_k$  to a smaller finite domain.

### Step 2: Convergence detection

- 👉 Problem: message queues are quite different from contexts.

## Second, empirical evaluation

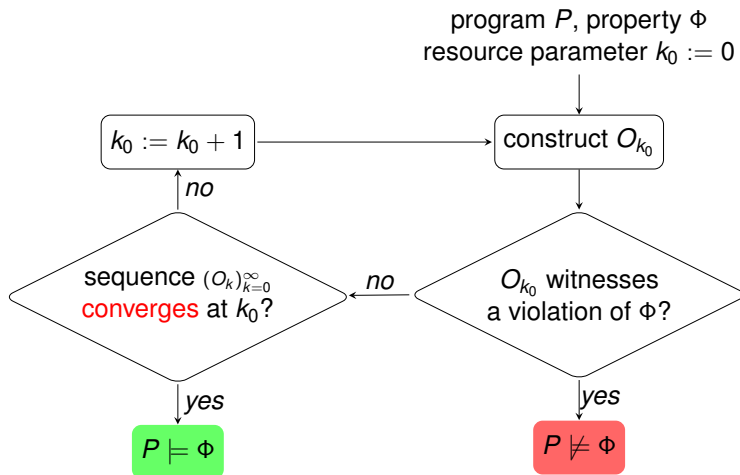
- 👉 Evaluate our approach on an extensive collection of P programs [PLDI'13].

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We proposed a **uniform** technique of **observation sequences** for *unbounded* analysis of resource-parameterized programs

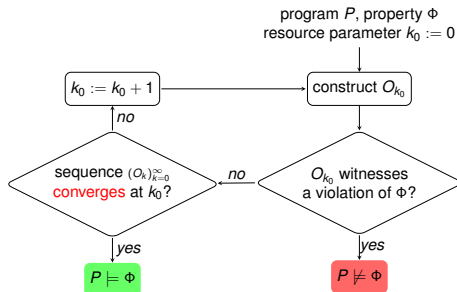


## The technique can be applied to different problems






- Context-Unbounded Analysis
- Queue-Parameterized Analysis (work-in-progress)
- ...

# We plan future work as follows

October 2018	Proposal
October 2018 – February 2019	Queue-parameterized analysis
February 2019 – May 2019	More applications
May 2019 – July 2019	Improving the scalability of our tools; writing dissertation
August 2019	Defense



# References

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-  Liu, P., Wahl, T.: “CUBA: Interprocedural context-unbounded analysis of concurrent programs.” In: PLDI. (2018)