#### Sampling-based Runtime Verification Borzoo Bonakdarpour, Samaneh Navabpour and Sebastian Fischmeister

Presented by: Bo Yang

#### Outline

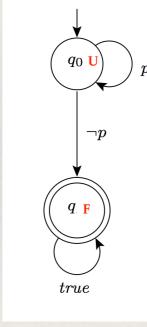
- \* Background
- Problem description
- \* Solutions presented in the paper
- Experimental Results
- Conclusion and critiques

- Runtime Verification
  - differs from theorem proving, model checking
  - differs from testing
  - is to check whether a run of a system under scrutiny satisfies or violates a given correctness property
  - by synthesising the property to the monitor
  - \* The monitor observes and analyses the runs

x = 0 y = 0 while (cond) { if (cond') x = 0; x++; y++; }

IJ

Property: Always (x <= 10) safety property and monitorable Let p denote x<=10



Synthesised Monitor

Possible runs:

 $x = 0 \rightarrow x = 1 \rightarrow x = 2 \rightarrow ... > x = 10 \rightarrow x = 11 \rightarrow x = 0 \rightarrow ...$ 

 $x = 0 \rightarrow x = 1 \rightarrow x = 2 \rightarrow ... > x = 10 \rightarrow x = 0 \rightarrow x = 1 \rightarrow ...$ 

U U U .... U U U ...

U U ...U.. U F

 $\mathbf{x} = \mathbf{0}$ Property: Always ( $x \le 10$ )  $\mathbf{y} = \mathbf{0}$ safety property.and monitorable while (cond) { Let p denote x<=10 if (cond') x = 0;x++; x is the variable of interest v++;  $q_0 \mathbf{U}$ Possible runs:  $x = 0 \rightarrow x = 1 \rightarrow x = 2 \rightarrow \dots > x = 10 \rightarrow x = 11 \rightarrow x = 0 \rightarrow \dots$ U U ..U.. U F TT  $x = 0 \rightarrow x = 1 \rightarrow x = 2 \rightarrow ... > x = 10 \rightarrow x = 0 \rightarrow x = 1 \rightarrow ...$ true U U U .... U U U ...

Synthesised Monitor

Control Flow Graph

**Definition 1.** The control-flow graph of a program P is a weighted directed simple graph  $CFG_P = \langle V, v^0, A, w \rangle$ , where:

- -V: is a set of vertices, each representing a basic block of P. Each basic block consists of a sequence of instructions in P.
- $-v^0$ : is the initial vertex with indegree 0, which represents the initial basic block of P.
- A: is a set of arcs (u, v), where  $u, v \in V$ . An arc (u, v) exists in A, if and only if the execution of basic block u can immediately lead to the execution of basic block v.
- w: is a function  $w : A \to \mathbb{N}$ , which defines a weight for each arc in A. The weight of an arc is the best-case execution time (BCET) of the source basic block<sup>1</sup>.

Notation: Let v be a vertex of a control-flow graph. Since the weight of all outgoing arcs from v are equal, w(v) denotes the weight of the arcs that originate from v.

#### Control Flow Graph: an example

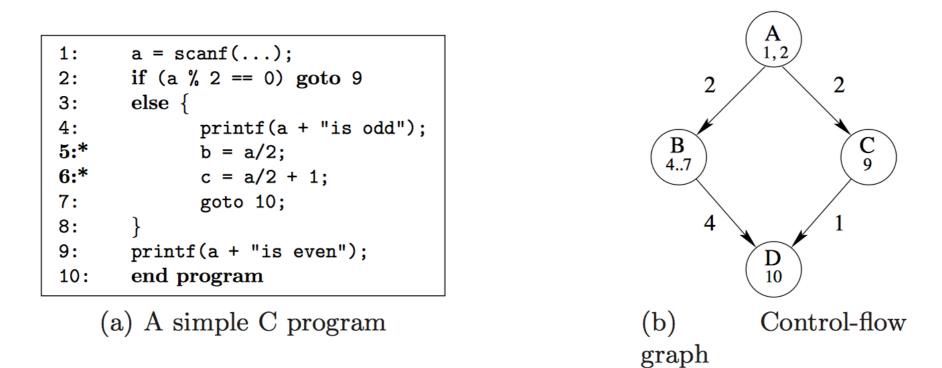


Fig. 1. A C program and its control-flow graph.

## **Problem Description**

- \* When to invoke the monitor?
  - Every time value of the variables of interest change or every fixed interval ('event triggered' or 'time triggered')
  - Event triggered vs. Time triggered
    - 'Event triggered' introduces unpredictable overhead, bursts of interruptions, possible probe effect
    - 'Time triggered' results in predictable overhead, likely longer overall executing time
  - In CPS application domain, predictability is highly desired. 'Time triggered' monitor is a periodic task. Easy to schedule!

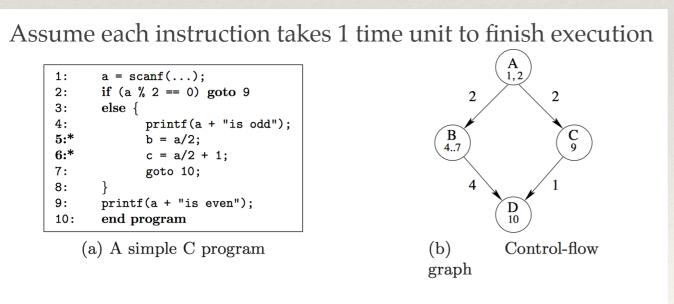
# Problem Description

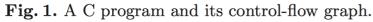
- \* How to decide the sampling period
  - \* The naive way is to choose the minimum time that the variables of interest change their values
  - \* Increase the sampling period by memorising the values change history
    - Need auxiliary memory. Trade off between auxiliary memory and sampling period. Find the optimality!
    - Increasing overhead

#### Solutions

First, construct the critical CFG (Control Flow Graph)
from CFG

Step1: Each critical instruction is in a basic block that contains no other instructions.Step2: Uncritical vertices play no role in determining the sampling period. Collapse uncritical vertices.





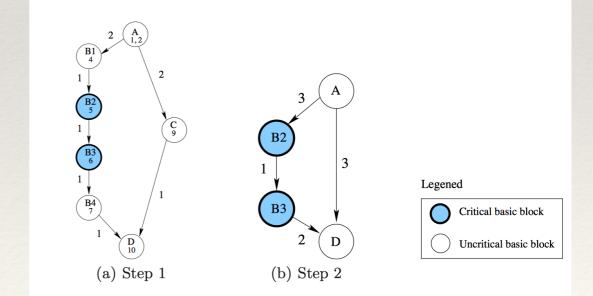


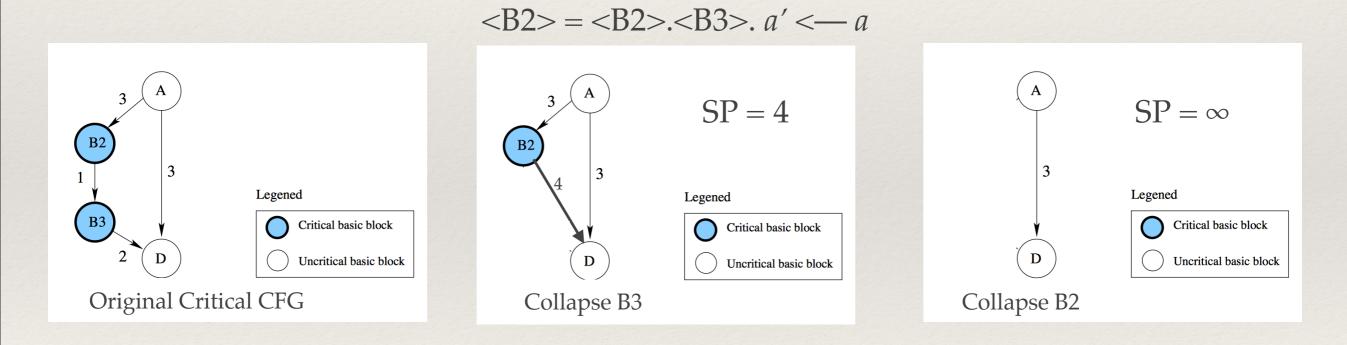
Fig. 2. Obtaining a critical CFG and calculating the sampling period.

# Solution1–Applying MSP

- Minimum Sample Period (MSP) = min {w(v1,v2) | (v1, v2) ∈ A ∧ v1 is a critical vertex}
- \* For our example, MSP = 1
- \* Applying MSP, no property violations can be overlooked.
- \* But the overhead is increased, overall execution time is increased a lot.

- How to build a history of critical state changes between two samples?
  - Add instruments to related blocks, like a' <— a (a is a variable) meaning saving a to memory location a'.</li>
  - Instrumenting is a technique used in software debugging, monitoring without affecting the program's correctness.

#### \* Collapse critical blocks.



- Optimization problem: minimizing auxiliary memory and maximising sampling period
  - \* Reduced to a decision problem: Does there exist a set U⊆ V, such that after applying collapsing all u∈U, we obtain a critical control-flow graph  $CFG' = \langle V', v^0, A', w' \rangle$ , where  $|U| \langle = Y$  and for all arcs  $(u,v) \in A'$ ,  $w'(u,v) \rangle = X$ ? (NP-Complete)
  - \* Mapped to ILP (integer linear programming). Minimize the number of instrumentations while satisfying SP requirement.
  - \* ILP solvers solve such problems: minimize some term while subjected to some constraints. (e.g.  $2^*x+y \ge 4 \land x+2^*y \ge 2$ , minimize x+y)

#### The corresponding ILP model

**Integer variables.** Our ILP model employs the following sets of variables:

- 1.  $\mathbf{x} = \{x_v \mid v \in V\}$ , where each  $x_v$  is a binary integer variable: if  $x_v = 1$ , then vertex v is removed from V, whereas  $x_v = 0$  means that v remains in V.
- 2.  $\mathbf{a} = \{a_v \mid v \in V\}$ : where each  $a_v$  is an integer variable which represents the weight of arcs originating from vertex v. Recall that all the outgoing arcs of a vertex have the same weight in *CFG*. This variable is needed to store the new weight of an arc created by merging a sequence of arcs. For example, in Figure 2(b), initially, variable  $a_{B_2} = 1$ . However, if  $x_{B_3} = 1$  (i.e., vertex  $B_3$  is removed), then  $a_{B_2} = 3$ .

The goal is to

Minimize  $\sum_{v \in V} x_v$ 

#### **Experimental Results**

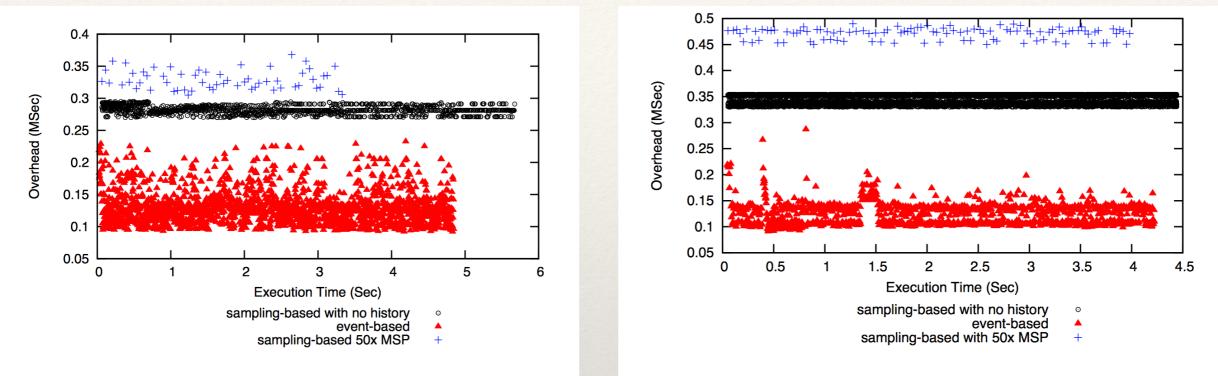


Fig. 4. Experimental results for Dijktra (50 \* MSP sampling period).

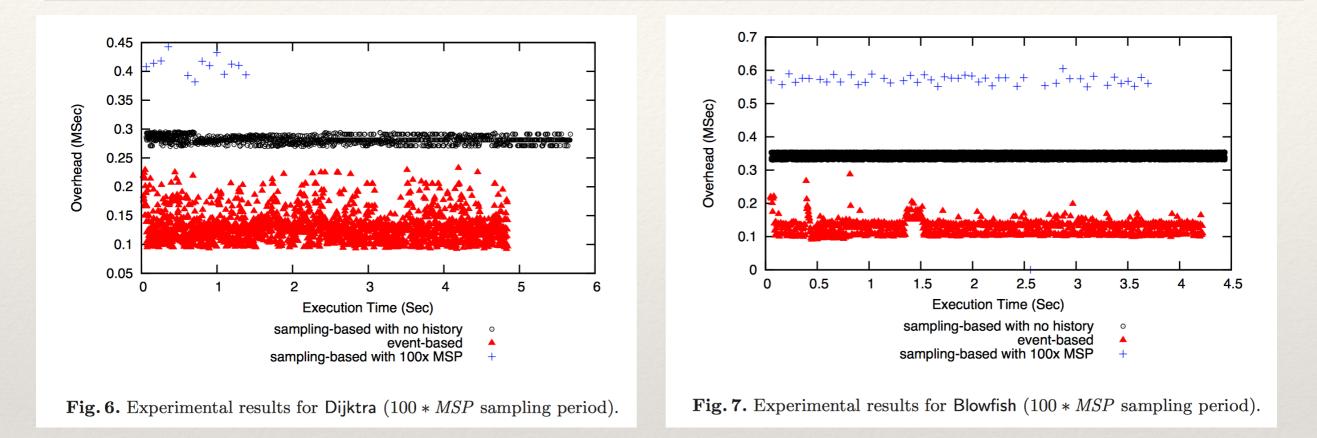
Fig. 5. Experimental results for Blowfish (50 \* MSP sampling period).

For event-triggered, overhead is subjected to bursts while the overhead for sampling-based monitors remains consistent and bounded.

Increased overhead for sampling-based monitors. May or may not increase the overall execution time.

Adding history causes variability in data extraction overhead, but still better than event-triggered. 16

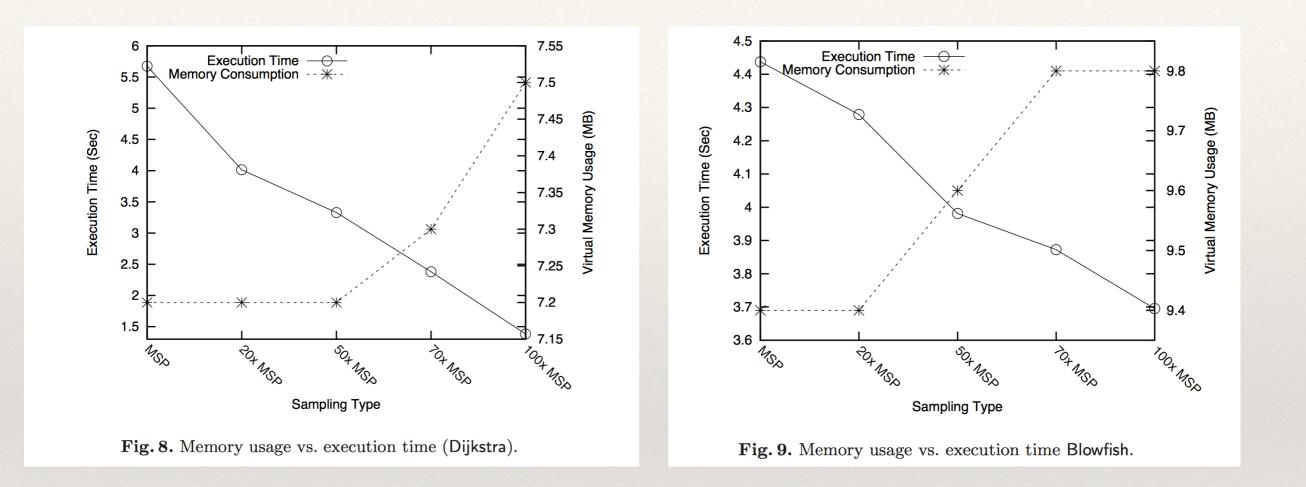
#### **Experimental Results**



Due to the fact that more and larger variables are stored in the history between two samples for Blowfish, the reduction in execution time of Blowfish is less than Dijkstra.

The number of variables stored in the history from one sample to another does not significantly change in Blowfish, thus the overhead variability in Blowfish is smaller than that in Dijktra.

#### **Experimental Results**



#### To increase the sampling period, the system requires negligible extra memory.

## **Conclusions and Critiques**

- \* Sampling-based approach for runtime verification is investigated, and defined in formal terms.
- Using minimum auxiliary memory to maximize the sampling period is NPcomplete.
- \* The problem is encoded in ILP as a practical solution.
- Sampling-based monitoring provides a predictive overhead.

Critiques:

- 1. Some programs may not be able to transformed to CFG.
- 2. MSP is pessimistic ?
- 3. Adding interments may result in missing deadline, thus constrained ability to increase SP.
- 4. Detection delay problem.
- 5. A heuristic algorithm is desired if the problem becomes too complicate for ILP solvers.