

Probabilistic Detection and Sampling of Concurrency Bugs

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Radius-aware Probabilistic Deadlock detection

ASE'16

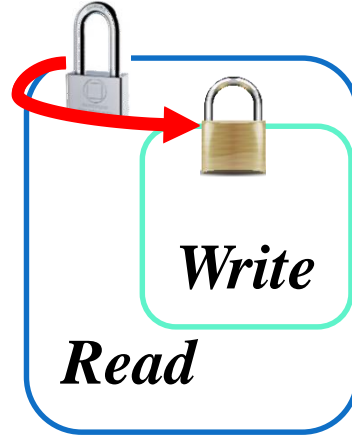
Yan Cai and Zijiang Yang

Locks and Deadlocks

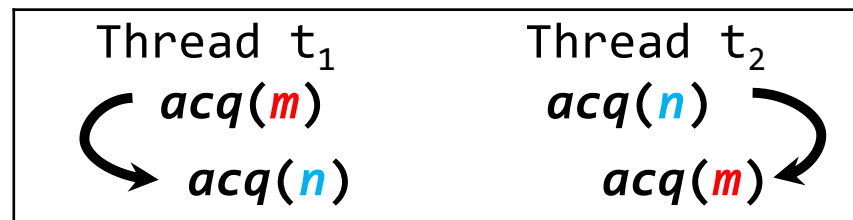
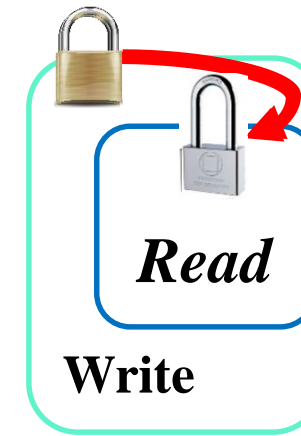
Thread 1 Thread 2



Thread 1



Thread 2



Deadlock Testing

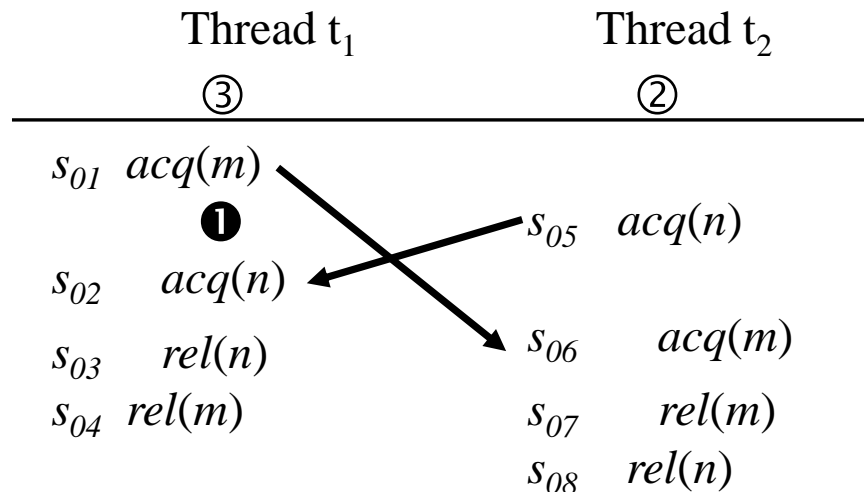
- Random testing
 - OS scheduling + random manipulation
 - Stress testing
 - Heuristic directed random testing
 - Systematic scheduling

No Guarantee to find a
concurrency bug (e.g., Deadlock)

PCT – Probabilistic Concurrency Testing

- PCT Algorithm
 - Mathematical randomness with Probabilistic Guarantees

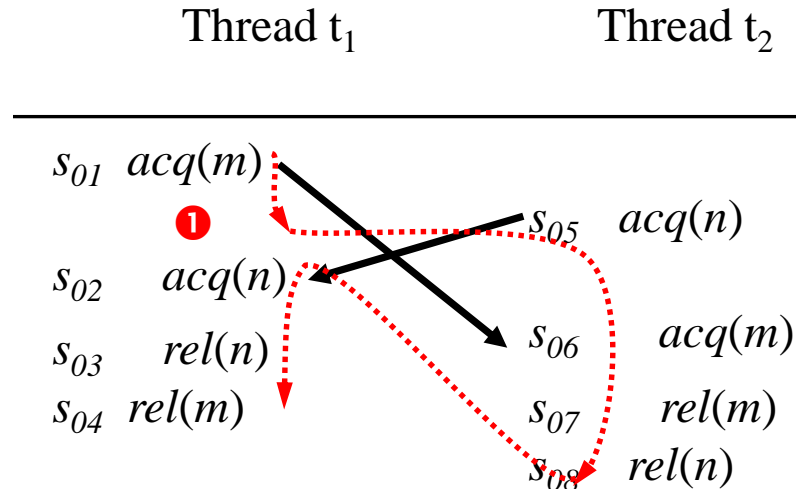
$$\frac{1}{n \times k^{d-1}} \quad n: \text{\#threads}, k: \text{\#events}, d: \text{bug depth}$$



$$k=8, n=2, d=2$$
$$\frac{1}{2 \times 8^{2-1}} = 1/16$$

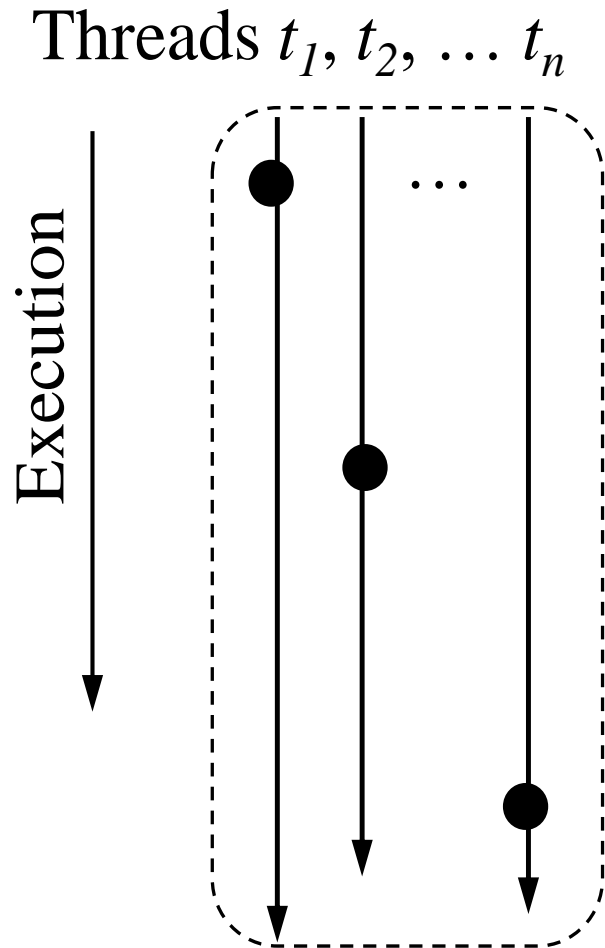
PCT – Probabilistic Concurrency Testing

- PCT :
 - Intuition of guaranteed probability:
 1. satisfy the 1st order by assigning the thread a largest **priority** ($1/n$)
 2. select $d - 1$ **priority change points** at the remaining $d - 1$ order position ($1/k \times 1/k \times \dots \times 1/k = \frac{1}{k^{d-1}} \Rightarrow \frac{1}{n \times k^{d-1}}$)



$$k=8, n=2, d=2$$
$$\frac{1}{2 \times 8^{2-1}} = 1/16$$

PCT – Probabilistic Concurrency Testing



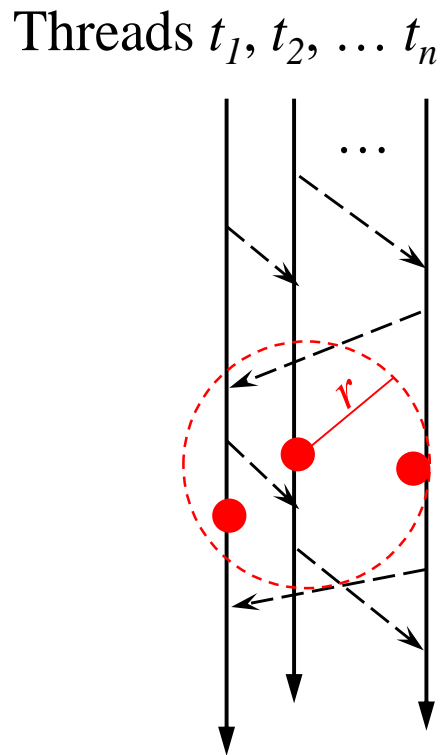
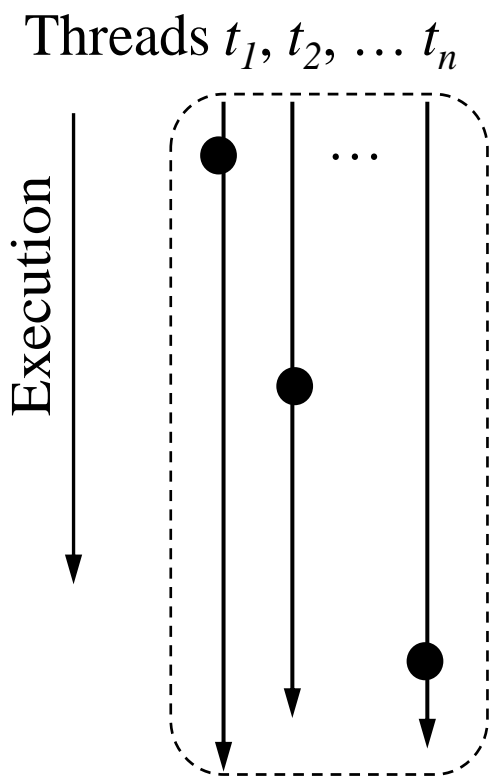
- Provide a guarantee (a probability):
$$\frac{1}{n \times k^{d-1}}$$
 n : #threads, k : #events, d : bug depth

But ...

- Theoretical model, not consider thread interaction:
real executions do not follow designed executions
- Guaranteed probability decreases exponentially with increase of bug depth: due to factor $\frac{1}{k^{d-1}}$.

RPro- Radius aware

- Our approach: RPro – Radius aware Probabilistic testing



- Consider thread interaction
- Guaranteed probability decreases: $\frac{1}{r}$ (not $\frac{1}{k}$, $r \ll k$)

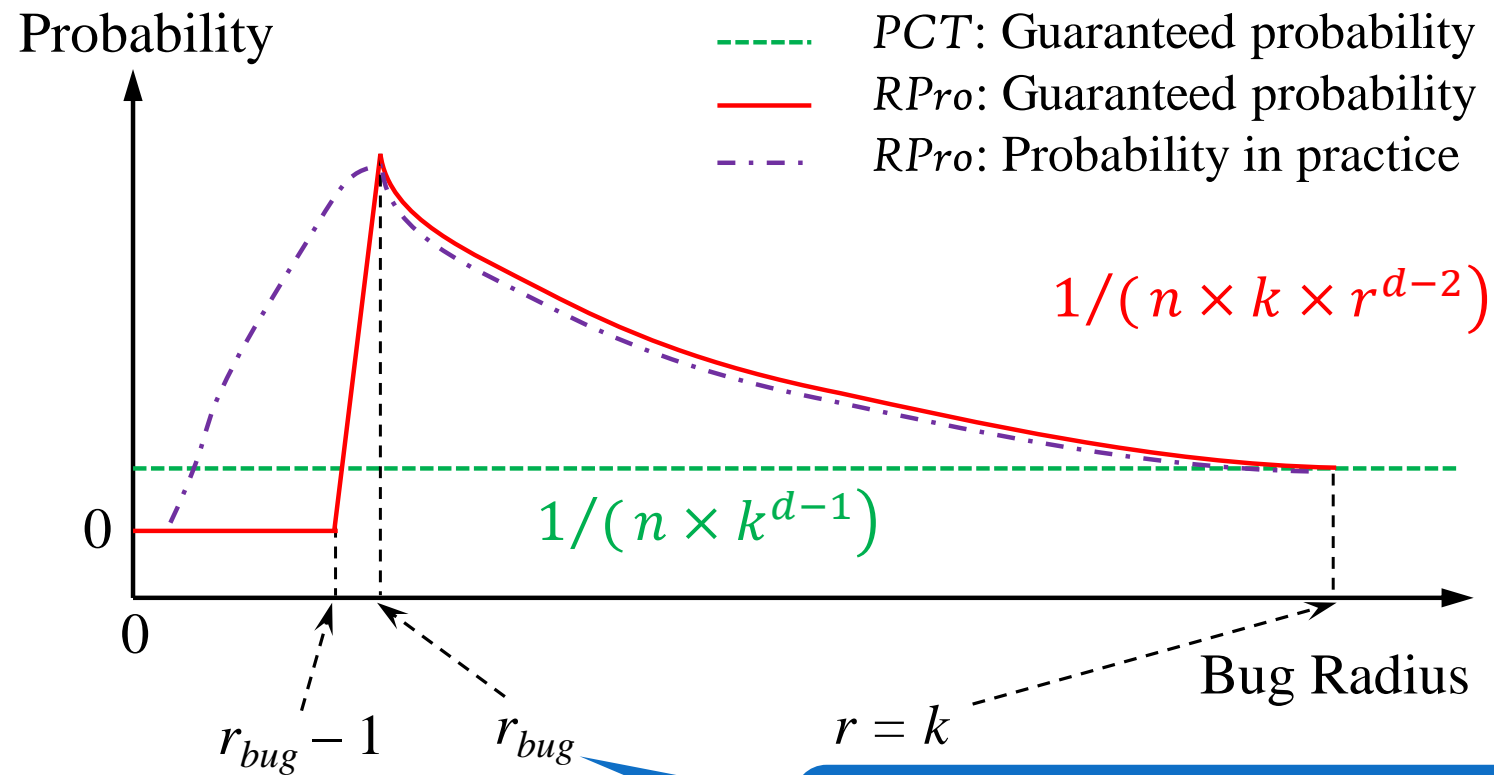
$$\frac{1}{n \times k^{d-1}}$$

$$\frac{1}{n \times k \times r^{d-2}}$$

PCT v.s. RPro

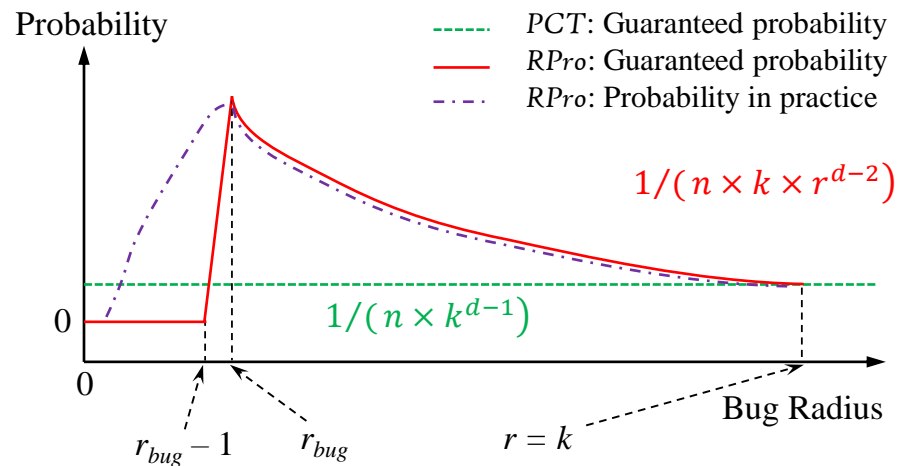
RPro- Radius aware

- RPro: Theoretical guarantee



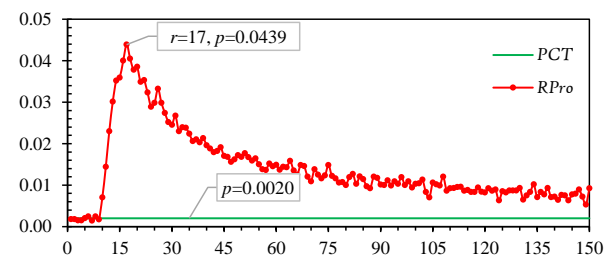
How to find r_{bug} ?

Experiment

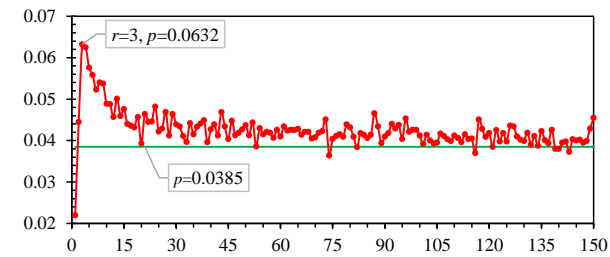


Benchmark	# events	# threads	bug depth	r_{best}^*	$\frac{r_{best}}{\#events}$	Probability
Hawkn1	28	3	3	2	-	0.4530
SQLite	16	3	3	2	-	0.6863
JDBC-2	5,050	3	3	3	0.059%	0.0632
JDBC-4	5,090	3	3	5	0.098%	0.1123
JDBC-3	5,080	3	3	11	0.217%	0.0229
JDBC-1	5,088	3	3	17	0.334%	0.0439
MySQL-4	444,621	19	3	20	0.005%	0.0062
MySQL-2	15,066	17	3	27	0.179%	0.0256
MySQL-1	19,300	16	3	47	0.244%	0.0022
MySQL-3	406,117	22	6	114	0.028%	0.0039

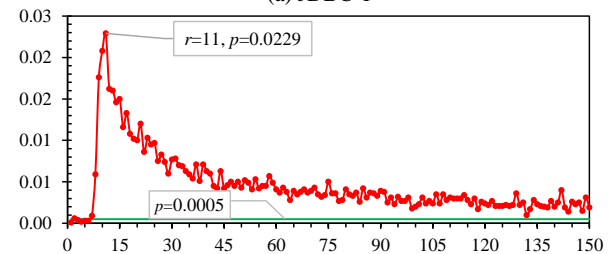
(* All rows are sorted on the data in this column.)



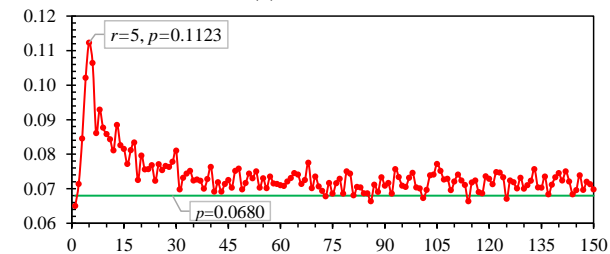
(a) JDBC-1



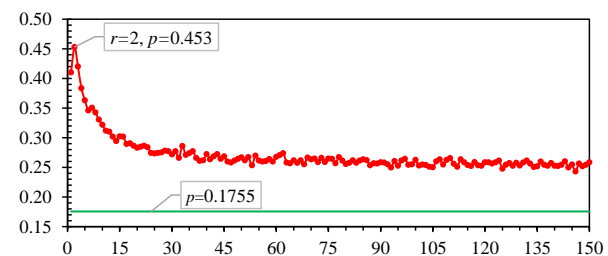
(b) JDBC-2



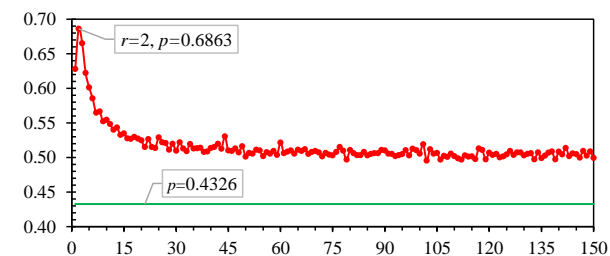
(c) JDBC-3



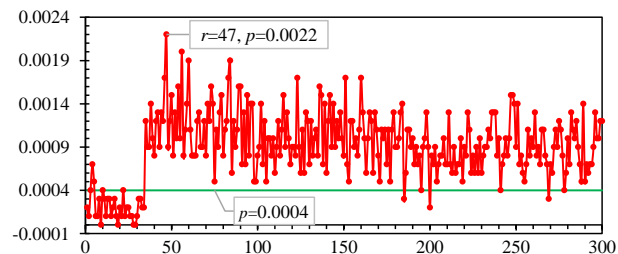
(d) JDBC-4



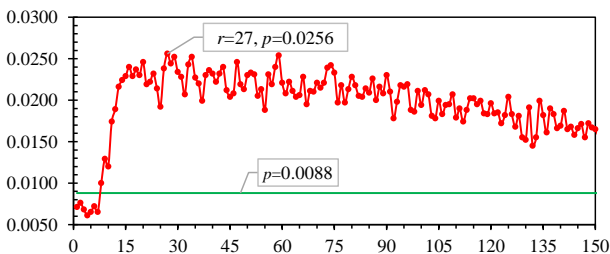
(e) Hawkn1



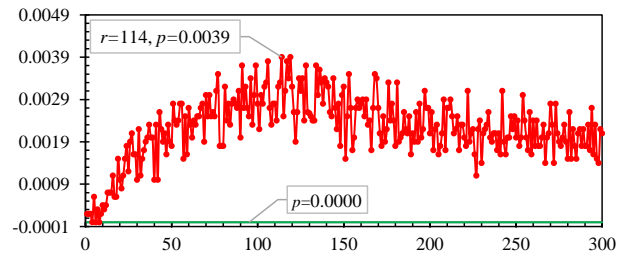
(f) SQLite



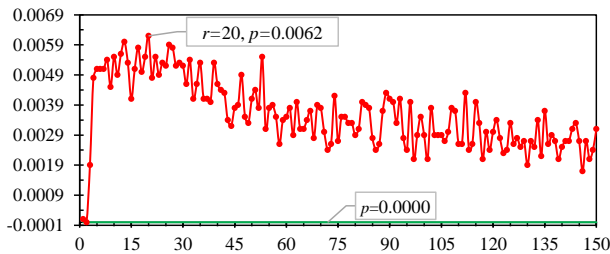
(g) MySQL-1



(h) MySQL-2



(i) MySQL-3



(j) MySQL-4

Deployable Data Race Sampling

FSE'16

Yan Cai, Jian Zhang, Lingwei Cao, and Jian Liu

Concurrency bugs

- Difficult to detect
 - Non-determinism (space explosion)
 - Inadequate test inputs
 - ...
- Even after software release, concurrency bugs may still occur



Concurrency bugs

- It is necessary to detect concurrency bugs in deployed products
- Challenges:
 - not to disturb normal executions
 - light-weighted **<5% overhead**
 - ...



Sample user executions

Existing works

- Data Race

Two threads **concurrently access** the same memory location and at least one access is a write.

- Happens-before (HB Race)

- Access pairs not ordered by happens-before relation (HBR)

Thread t_1 Thread t_2

`x++;`
`sync(m){}` `sync(m)`
 `{x++;}`

Value of x : +2.

Thread t_1 Thread t_2

`x++;`
`sync(m){}` `sync(m)`
 `{x++;}`

Value of x : +1 or +2?

Existing works

- Happens-before Races
 - Track full Happens-before relation
 - *Incurring many $O(n)$ operations*

0% sampling rate => ~30%
overhead

(Pacer, PLDI'10)
~15% in our experiment

Insight 1:
Not to track Full Happens-before Relation

Existing works

- Hardware based (e.g., DataCollider, OSDI'10)
 - **Code Breakpoints** and **Data Breakpoints**
(or **Watchpoints**)
 - Collision Races
- A data race: two accesses
 - Select a memory address =>
Set a data breakpoint =>
Wait for the breakpoint to be fired
 - **The waiting time directly increases the sampling overhead**

Insight 2: Not to directly delay executions

Existing works

- ...
- *See our paper for more insights*

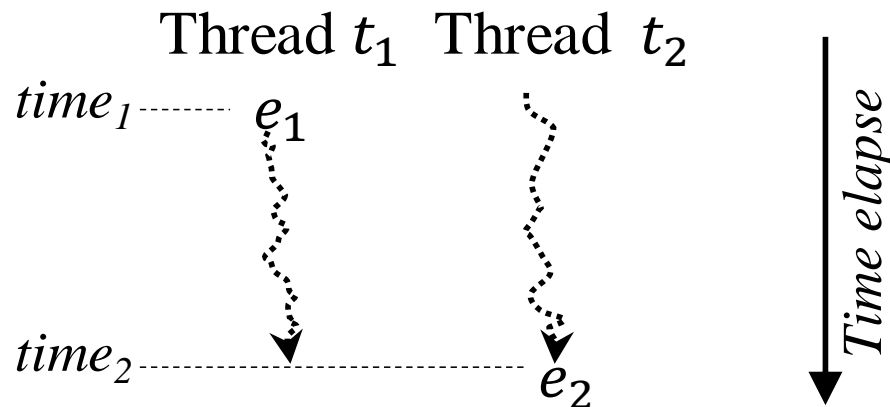
Our Proposal

- Clock Race
 - For data race sampling purpose
- CRSampler
 - To detect clock races

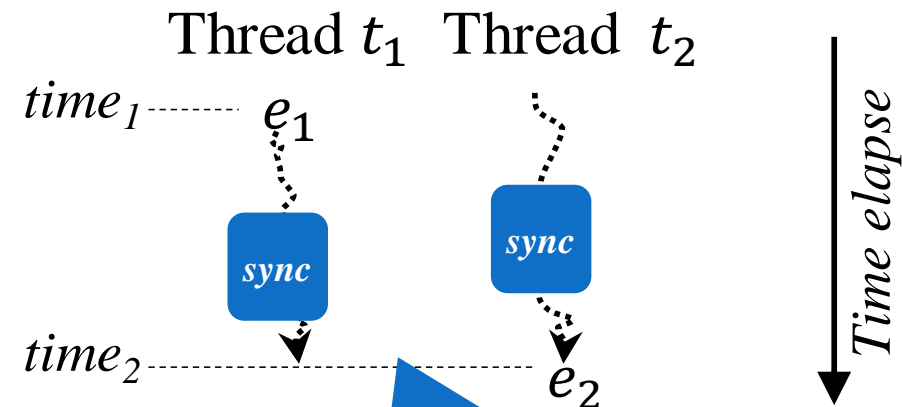
Clock Race

- **Clock Race**

- **Thread-local clock:** an integer for each thread, increased on synchronization operation.
- Two accesses (with at least a write) form a Clock Race if:
at least one thread-local clock is not changed in between the two accesses

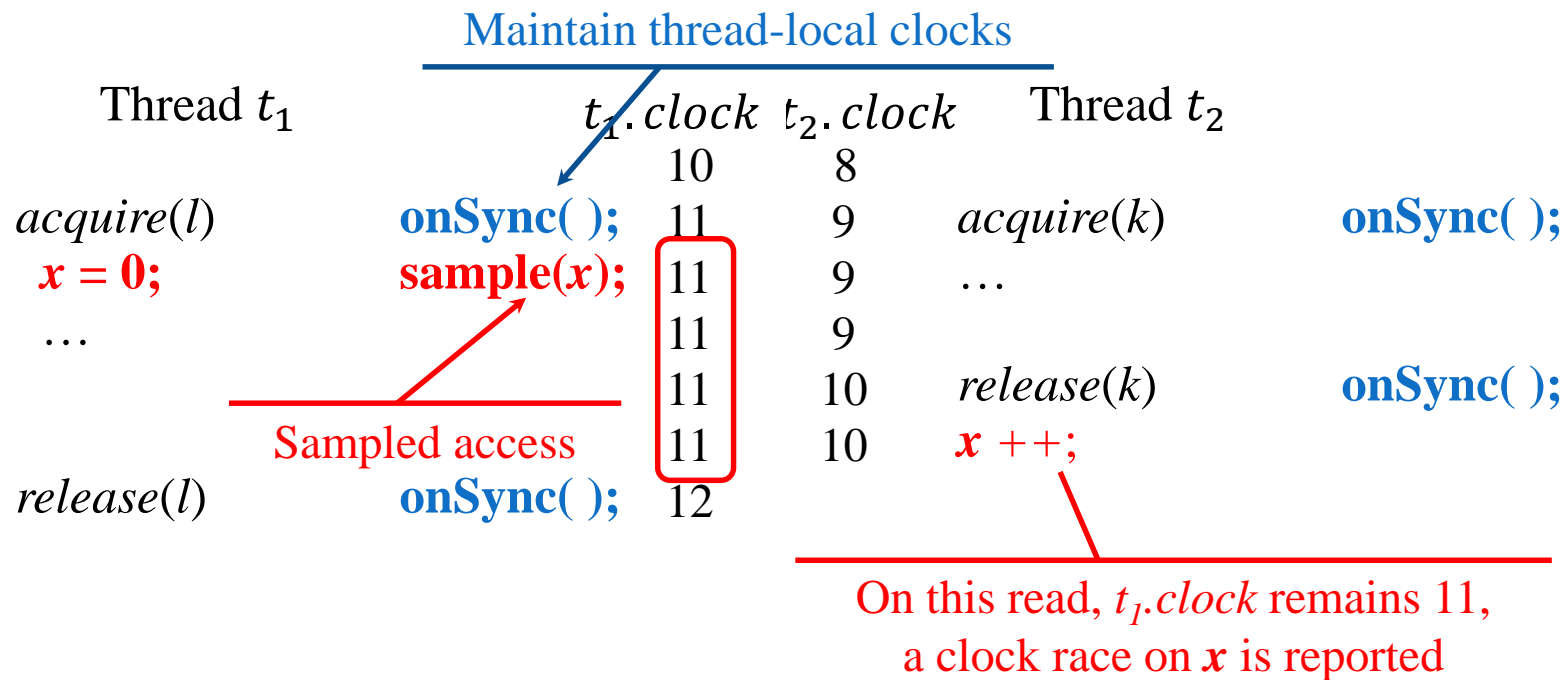


t_1 .clock is not changed between $time_1$ and $time_2$.



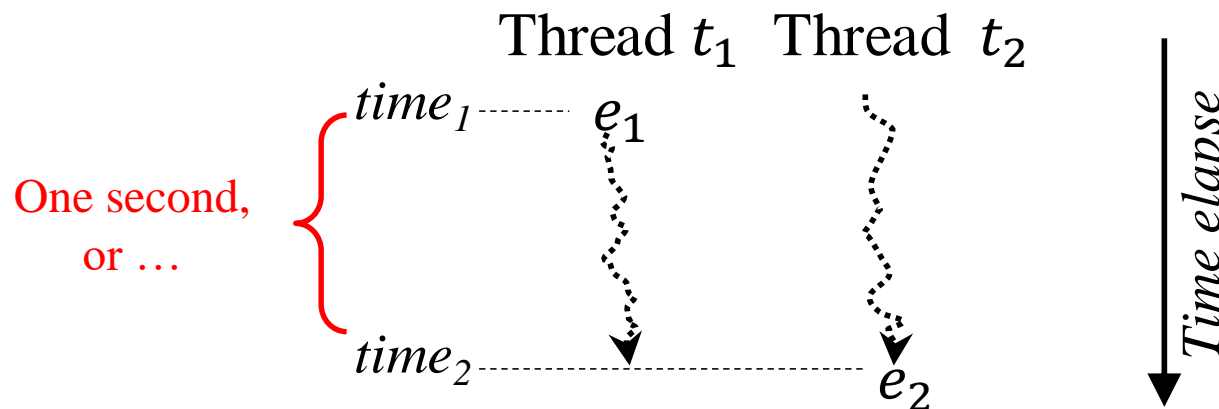
Clock Race

- A Quick Demonstration



Clock Race

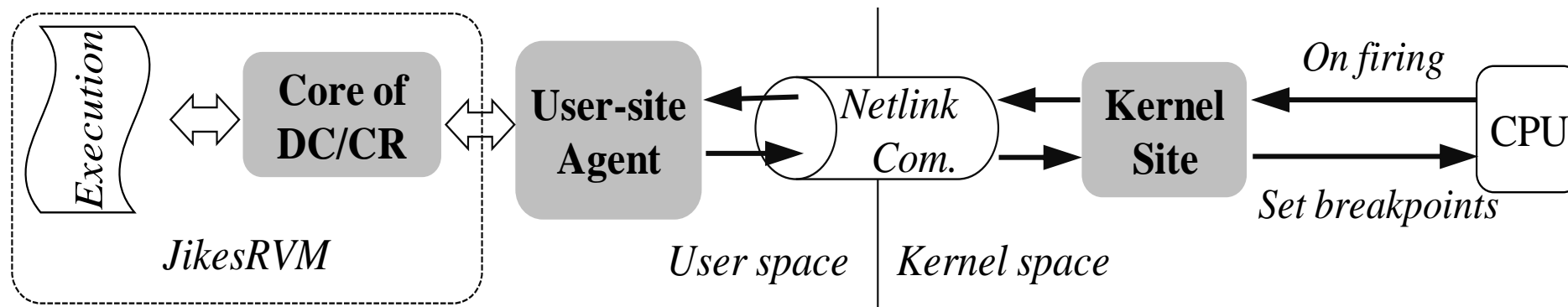
- Clock Race
 - Race checking does not need to delay any thread.
 - But: after e_1 appears, how much time is required to check two accesses?
 - Given a short time, it is not enough to trap the second access.
 - Given a long time, all threads' lock clocks are changed.



t_1 .clock is not changed between $time_1$ and $time_2$.

Setup

- Implementation
 - Jikes RVM
 - Sampling: Java class load time
 - Memory accesses \Leftrightarrow Linux Kernel



- Benchmarks
 - Dacapo benchmark suite

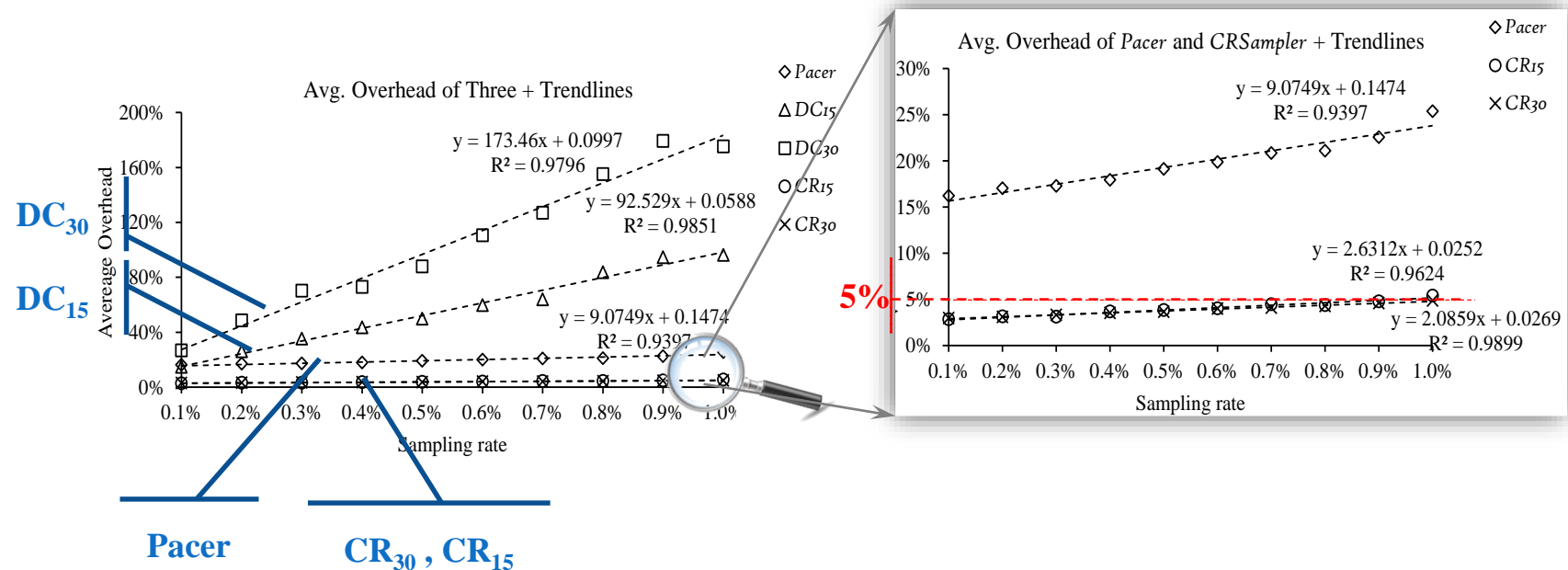
Setup

- Comparisons
 - Sampling rate: 0.1% to 1.0%
 - **Pacer** (PLDI'10)
 - **Data Collider** (OSDI'10)
 - **CRSampler**
- 15ms, 30ms { $\text{DC}_{15}, \text{DC}_{30}$
 $\text{CR}_{15}, \text{CR}_{30}$
- ThinkPad Workstation
 - I7-4710MQ CPU, four cores, 16G memory, 250G SSD

Experiments

- Overall Results
 - Effectiveness
 - CR: more data races at low sampling rates
 - Overhead

Bench- marks	Binary Size (KB)	# of threads	# of sync.	<i>Pacer</i> [*]	<i>DC</i> ₁₅	<i>DC</i> ₃₀	<i>CR</i> ₁₅	<i>CR</i> ₃₀
avro ₀₉	2,086	7	3,312,801	3	3	3	5	3
xalan ₀₆	1,027	9	35,859,489	5	5	5	87	81
xalan ₀₉	4,827	9	12,599,144	0	2	2	84	91
sunflow ₀₉	1,017	17	1,590	0	0	2	46	45
pmd ₀₉	2,996	9	20,550	4	2	2	110	121
eclipse ₀₆	41,822	16	51,131,093	19	2	6	58	63
Sum:				31	14	20	390	404



Experiments

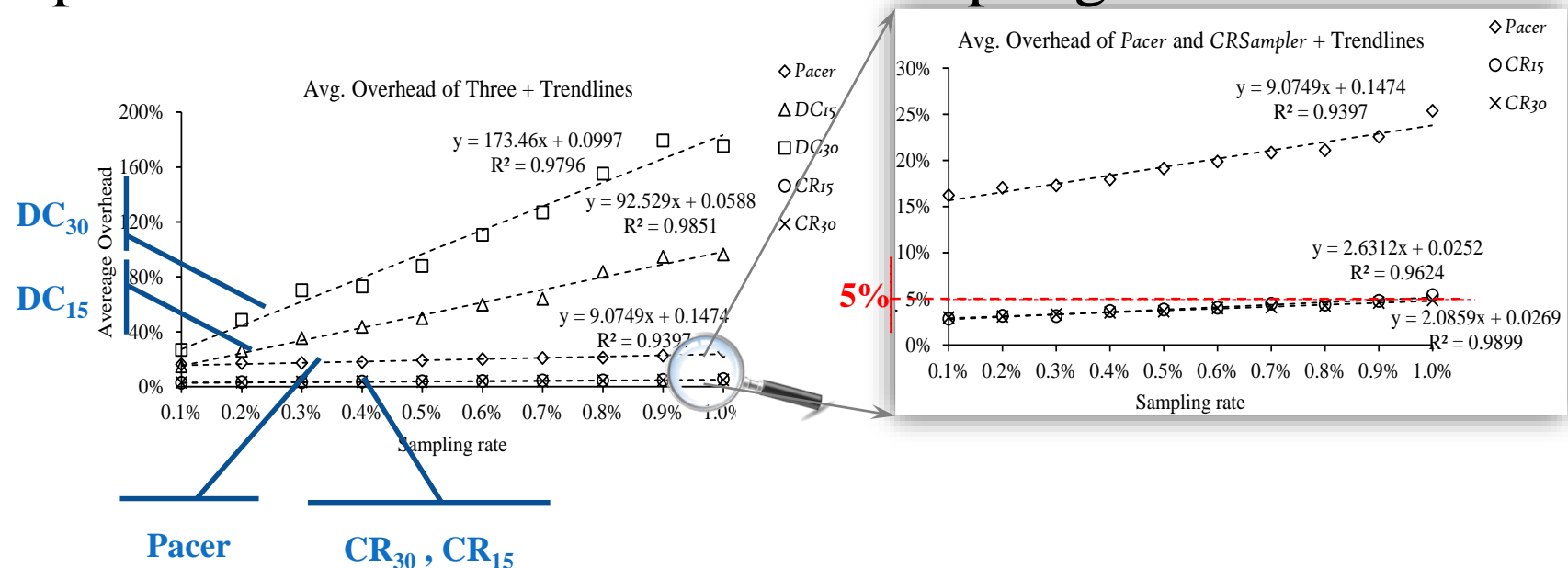
- Discussions

- DataCollider: overhead from its delays.

- DC₃₀ has almost **2 times** overhead than DC₁₅.

- Pacer: basic overhead **~15%**

- CRSampler: **~5%** overhead at **1.0%** sampling rate.



Thanks~