# Compositional Bitvector Analysis For Concurrent Programs With Nested Locks 

Zachary Kincaid<br>joint work with Azadeh Farzan

University of Toronto

September 14, 2010

## Contribution

Algorithm for solving bitvector problems for concurrent programs

- Handles dynamic synchronization precisely
- Thread compositional
- Scales in \# of threads
- Solves the problem for every fact and every location simultaneously


## Bitvector Analyses

- Let $D$ be a finite set of data flow facts
- For each statement $s$, define
- $\operatorname{gen}(s) \subseteq D$ : set of facts generated by $s$
- $\operatorname{kill}(s) \subseteq D$ : set of facts killed by $s$
- $\llbracket s \rrbracket(i n)=(i n \backslash \operatorname{kill}(s)) \cup \operatorname{gen}(s)$



## Bitvector Analyses

- Let $D$ be a finite set of data flow facts
- For each statement $s$, define
- $\operatorname{gen}(s) \subseteq D$ : set of facts generated by $s$
- $\operatorname{kill}(s) \subseteq D$ : set of facts killed by $s$
- $\llbracket s \rrbracket(i n)=(i n \backslash \operatorname{kill}(s)) \cup \operatorname{gen}(s)$
- Let $D=\mathbb{B}^{n}(\mathbb{B}=\{t t, f f\})$
- $\llbracket s \rrbracket\left(\left\langle i n_{1}, \ldots, i n_{n}\right\rangle\right)=\left\langle\llbracket s \rrbracket_{1}\left(i n_{1}\right), \ldots, \llbracket s \rrbracket_{n}\left(i n_{n}\right)\right\rangle$



## Bitvector Analyses

- Let $D$ be a finite set of data flow facts
- For each statement $s$, define
- $g e n(s) \subseteq D$ : set of facts generated by $s$
- $\operatorname{kill}(s) \subseteq D$ : set of facts killed by $s$
- $\llbracket s \rrbracket(i n)=(i n \backslash \operatorname{kill}(s)) \cup \operatorname{gen}(s)$
- Let $D=\mathbb{B}^{n}(\mathbb{B}=\{t t, f f\})$
- $\llbracket s \rrbracket\left(\left\langle i n_{1}, \ldots, i n_{n}\right\rangle\right)=\left\langle\llbracket s \rrbracket_{1}\left(i n_{1}\right), \ldots, \llbracket s \rrbracket_{n}\left(i n_{n}\right)\right\rangle$

- Examples: Reaching definitions, available expressions, live variables, ...
- We will concentrate on forwards flow, may analyses (e.g. reaching definitions)


## Related work

- Parallelism for free! [Knoop et al, TOPLAS96]
- Precise bitvector analysis for cobegin/coend parallelism
- Some generalizations [Esparza \& Knoop, FOSSACS99; Esparza \& Podelski, POPL00; Seidl \& Steffen, ESOP00; Knoop, Euro-Par98]
- Nested locks [Kahlon \& Gupta, POPL07]

Determine whether two local paths (run suffixes) can be interleaved

- Compute local lock information for each path
- Consistency check on local lock information


## Program model

- Finite set of threads
- Optional: infinitely many copies of each thread run simultaneously
- Finite set of locks
- All threads start executing at the beginning of the program
- No locks are held in the initial state
- Each thread releases locks in the reverse order they were acquired

```
Not allowed: acq(l); acq(m); rel(l); rel(m)
```


## Concurrent Bitvector Analyses

- Optimal solution (sequential case): meet over paths
- Optimal solution (concurrent case): meet over feasible runs
- A run is feasible if
- When projected onto a single thread, it corresponds to a path in the CFG
- No two threads hold the same lock simultaneously


## Concurrent Bitvector Analyses

- Optimal solution (sequential case): meet over paths
- Optimal solution (concurrent case): meet over feasible runs
- A run is feasible if
- When projected onto a single thread, it corresponds to a path in the CFG
- No two threads hold the same lock simultaneously

Thread $1 \quad$ Thread 2

```
acquire(l) acquire(m)
acquire(m) x = 0
x = x + 1 x = 1
release(m) y = 0
x = x * 2 release(m)
```

release (1)

## Concurrent Bitvector Analyses

- Optimal solution (sequential case): meet over paths
- Optimal solution (concurrent case): meet over feasible runs
- A run is feasible if
- When projected onto a single thread, it corresponds to a path in the CFG
- No two threads hold the same lock simultaneously

| Thread 1 <br> acquire(1) <br> acquire (m) <br> $\mathbf{x}=\mathbf{x}+1$ <br> release ( m ) <br> $\mathbf{x}=\mathrm{x}$ * 2 <br> release(1) | Thread 2 acquire (m) $\mathbf{x}=0$ $\mathbf{x}=1$ $y=0$ release (m) | Feasible run acquire(1) acquire (m) $\mathrm{x}=\mathrm{x}+1$ release ( m ) acquire (m) $f_{x}^{x}=0$ $f_{x}^{x}=x * 2$ | Infeasible run acquire (m) acquire(l) $x=0$ acquire (m) $x=x+1$ <br>  |
| :---: | :---: | :---: | :---: |

## Motivation

- Optimization
- Reaching definitions analysis can be used to construct dependence graphs, which may be useful for:
- Slicing
- Bootstrapping more sophisticated analyses (e.g. interval analysis)


## Parallelism for free!

Observation: there are 3 monotone functions on $\mathbb{B}$ :

- $i d=\lambda x$. $x$
- gen $=\lambda x$.tt
- kill $=\lambda x$.ff

A fact $f$ reaches $t$ iff there exists a witness run:


## Parallelism for free!

Observation: there are 3 monotone functions on $\mathbb{B}$ :
Witness
acquire (m)
$z=2$
acquire (l)
release (m)
acquire (m)
$x=0$
$\mathbf{x}=1$
$\mathbf{y}=0$
$r e l e a s e(m)$
$z=z-1$
$x=x+1$

- $i d=\lambda x . x$
$y=0$
- gen $=\lambda x$.tt
$\mathrm{x}=1$
- $k i l l=\lambda x . f f$
$\mathrm{x}=0$
A fact $f$ reaches $t$ iff there exists a witness run:



## Projection

- For every feasible run $\rho$ and every thread $T$, there exists a second feasible run with the same transitions in the same order, except no transitions of $T$ are executed [Kahlon et al., CAV05]
Witness
acquire ( m )
$z=2$
acquire ( 1 )
release $(\mathrm{m})$
acquire $(\mathrm{m})$
$\mathbf{x}=0$

| $x=1$ |
| :--- |
| $y=0$ |
| release ( $m$ ) |
| $z=z-1$ |
| $x=x+1$ |

## Projection

- For every feasible run $\rho$ and every thread $T$, there exists a second feasible run with the same transitions in the same order, except no transitions of $T$ are executed [Kahlon et al., CAV05]
- For every witness $\rho$ and every thread $T$, there exists a second witness with the same transitions in the same order, except no transitions of $T$ are executed

| Witness |
| :---: |
| acquire (m) |
| = 2 |
| acquire(1) |
| release (m) |
| acquire (m) |
| $\mathrm{x}=0$ |
| ${ }^{\text {x }}$ |
| $y=0$ |
| release (m) |
| $\underbrace{z}=\mathbf{z}-18$ |

## Projection

- For every feasible run $\rho$ and every thread $T$, there exists a second feasible run with the same transitions in the same order, except no transitions of $T$ are executed [Kahlon et al., CAV05]
- For every witness $\rho$ and every thread $T$, there exists a second witness with the same transitions in the same order, except no transitions of $T$ are executed


## Projection

- For every feasible run $\rho$ and every thread $T$, there exists a second feasible run with the same transitions in the same order, except no transitions of $T$ are executed [Kahlon et al., CAV05]
- For every witness $\rho$ and every thread $T$, there exists a second witness with the same transitions in the same order, except no transitions of $T$ are executed
- If there is a witness for a $t$, there is a witness
involving 1 or 2 threads


## Strategy

Compute 1-thread and 2-thread witnesses, then combine the results

- 1-thread witness computation = sequential bitvector analysis
- 2-thread witness computation
- For each thread, compute its set of generating and preserving runs
- For each pair of transitions from different threads, determine whether there is a generating run and preserving run that can be interleaved
- Questions:
(1) When can generating and preserving run can be interleaved?
(2) How can the (possibly infinite) sets of generating and preserving runs be represented?


## Local structure of witnesses



## Local structure of witnesses



## Local structure of witnesses



## Local structure of witnesses

Generating run

| acquire (m) | acquire (l) |
| :--- | :--- |
| $\mathbf{x}=0$ | acquire (m) |
| $\mathbf{x}=1$ | $\mathbf{x}=0$ |
| $\mathbf{y}=0$ | $\left(\begin{array}{l}x=1 \\ \text { release (m) } \\ y=0 \\ \text { release }(m) \\ \text { acquire }(m) \\ x=x+1\end{array}\right.$ |

Preserving run

```
acquire(1)
acquire (m)
\[
x=x+1
\]
```


## Compositional approach to bitvector analysis


preserving run

## generating run

## Compositional approach to bitvector analysis



## Compositional approach to bitvector analysis



## Compositional approach to bitvector analysis



## Compositional approach to bitvector analysis



## Compositional approach to bitvector analysis



## Compositional approach to bitvector analysis

Generating run

```
acquire (m)
x = 0
x = 1
y = 0
release(m)
```


## Compositional approach to bitvector analysis

|  | Witness |  |
| :---: | :---: | :---: |
|  | acquire (l) acquire (m) $\mathbf{x}=0$ |  |
| Generating run | $\begin{aligned} & x=1 \\ & y=0 \\ & \text { release }(m) \end{aligned}$ | Preserving run |
| acquire (m) | acquire (m) | acquire (1) |
| $\mathbf{x}=0$ | $\mathrm{m}_{\mathrm{x}}=\mathrm{x}+1$ | acquire (m) |
| $x=1$ |  | $\mathbf{x}=\mathbf{x}+1$ |
| $\begin{aligned} & y=0 \\ & \text { release (m) } \end{aligned}$ | Witness |  |
|  | $\begin{aligned} & \text { acquire (m) } \\ & \mathbf{x}=0 \\ & \text { acquire (l) } \end{aligned}$ |  |
|  | acquire (m) |  |
|  | $\left(\begin{array}{l} x=1 \\ y=0 \\ \text { release (m) } \end{array}\right.$ |  |
|  | ${ }_{x}=x+1$ |  |

## Strategy

Compute 1-thread and 2-thread witnesses, then combine the results

- 1-thread witness computation = sequential bitvector analysis
- 2-thread witness computation
- For each thread, compute its set of generating and preserving runs
- For each pair of transitions from different threads, determine whether there is a generating run and preserving run that can be interleaved
- Questions:
(1) When can generating and preserving run can be interleaved?
(2) How can the (possibly infinite) sets of generating and preserving runs be represented?


## Collecting generating and preserving runs

- Collecting trace semantics for $t$ :
- Domain: Set of traces
- Input: Set of traces to $t-\left\{\pi_{1}, \cdots, \pi_{n}\right\}$
- Output: Set of traces through $t-\left\{\pi_{1} t, \cdots, \pi_{n} t\right\}$
- LFP solution $=\operatorname{Collect}(t)$ : set of all traces to $t$


## Collecting generating and preserving runs

- Collecting trace semantics for $t$ :
- Domain: Set of traces
- Input: Set of traces to $t-\left\{\pi_{1}, \cdots, \pi_{n}\right\}$
- Output: Set of traces through $t-\left\{\pi_{1} t, \cdots, \pi_{n} t\right\}$
- LFP solution $=\operatorname{Collect}(t)$ : set of all traces to $t$
- Generating runs:
- Domain: Set of pairs of paths
- Input: Set of generating runs to $t$
- Output: Set of generating runs through $t$


## Collecting generating and preserving runs

- Collecting trace semantics for $t$ :
- Domain: Set of traces
- Input: Set of traces to $t-\left\{\pi_{1}, \cdots, \pi_{n}\right\}$
- Output: Set of traces through $t-\left\{\pi_{1} t, \cdots, \pi_{n} t\right\}$
- LFP solution $=\operatorname{Collect}(t)$ : set of all traces to $t$
- Generating runs:
- Domain: Set of pairs of paths



## Collecting generating and preserving runs

- Collecting trace semantics for $t$ :
- Domain: Set of traces
- Input: Set of traces to $t-\left\{\pi_{1}, \cdots, \pi_{n}\right\}$
- Output: Set of traces through $t-\left\{\pi_{1} t, \cdots, \pi_{n} t\right\}$
- LFP solution $=\operatorname{Collect}(t)$ : set of all traces to $t$
- Generating runs:
- Domain: Set of pairs of paths



## Collecting generating and preserving runs

- Collecting trace semantics for $t$ :
- Domain: Set of traces
- Input: Set of traces to $t-\left\{\pi_{1}, \cdots, \pi_{n}\right\}$
- Output: Set of traces through $t-\left\{\pi_{1} t, \cdots, \pi_{n} t\right\}$
- LFP solution $=\operatorname{Collect}(t)$ : set of all traces to $t$
- Generating runs:
- Domain: Set of pairs of paths



## Collecting generating and preserving runs

- Collecting trace semantics for $t$ :
- Domain: Set of traces
- Input: Set of traces to $t-\left\{\pi_{1}, \cdots, \pi_{n}\right\}$
- Output: Set of traces through $t-\left\{\pi_{1} t, \cdots, \pi_{n} t\right\}$
- LFP solution $=\operatorname{Collect}(t)$ : set of all traces to $t$
- Generating runs:
- Domain: Set of pairs of paths



## Collecting generating and preserving runs

- Collecting trace semantics for $t$ :
- Domain: Set of traces
- Input: Set of traces to $t-\left\{\pi_{1}, \cdots, \pi_{n}\right\}$
- Output: Set of traces through $t-\left\{\pi_{1} t, \cdots, \pi_{n} t\right\}$
- LFP solution $=\operatorname{Collect}(t)$ : set of all traces to $t$
- Generating runs:
- Domain: Set of pairs of paths
- Input: Set of generating runs to $t$
- Output: Set of generating runs through $t$



## Collecting generating and preserving runs

- Collecting trace semantics for $t$ :
- Domain: Set of traces
- Input: Set of traces to $t-\left\{\pi_{1}, \cdots, \pi_{n}\right\}$
- Output: Set of traces through $t-\left\{\pi_{1} t, \cdots, \pi_{n} t\right\}$
- LFP solution $=\operatorname{Collect}(t)$ : set of all traces to $t$
- Generating runs:
- Domain: Set of pairs of paths
- Input: Set of generating runs to $t$
- Output: Set of generating runs through $t$
- LFP solution = Generating $(t)$ : set of all generating runs to $t$
- Preserving runs can be computed similarly


## Strategy

Compute 1-thread and 2-thread witnesses, then combine the results

- 1-thread witness computation = sequential bitvector analysis
- 2-thread witness computation
- For each thread, compute its set of generating and preserving runs
- For each pair of transitions from different threads, determine whether there is a generating run and preserving run that can be interleaved
- Questions:
(1) When can generating and preserving run can be interleaved?
(2) How can the (possibly infinite) sets of generating and preserving runs be represented?


## Related work

- Parallelism for free! [Knoop et al, TOPLAS96]
- Precise bitvector analysis for cobegin/coend parallelism
- Some generalizations [Esparza \& Knoop, FOSSACS99; Esparza \& Podelski, POPL00; Seidl \& Steffen, ESOP00; Knoop, Euro-Par98]
- Nested locks [Kahlon \& Gupta, POPL07]

Determine whether two local paths (run suffixes) can be interleaved

- Compute local lock information for each path
- Locksets, acquisition histories
- Consistency check on local lock information


## Related work

- Parallelism for free! [Knoop et al, TOPLAS96]
- Precise bitvector analysis for cobegin/coend parallelism
- Some generalizations [Esparza \& Knoop, FOSSACS99; Esparza \& Podelski, POPL00; Seidl \& Steffen, ESOP00; Knoop, Euro-Par98]
- Nested locks [Kahlon \& Gupta, POPL07]

Determine whether two local paths (run suffixes) can be interleaved

- Compute local lock information for each path
- Locksets, acquisition histories
- Consistency check on local lock information


## Computing generating \& preserving runs

- $\mathcal{L}$ : local lock information from Kahlon \& Gupta
- Abstraction function: compute local lock information component-wise:

$$
\alpha\left(\left\{\pi_{1}, \pi_{2}, \cdots\right\}\right)=\left\{\operatorname{info}\left(\pi_{1}\right), \operatorname{info}\left(\pi_{2}\right), \ldots\right\}
$$

## Computing generating \& preserving runs

- $\mathcal{L}$ : local lock information from Kahlon \& Gupta
- Abstraction function: compute local lock information component-wise:

$$
\alpha\left(\left\{\pi_{1}, \pi_{2}, \cdots\right\}\right)=\left\{\operatorname{info}\left(\pi_{1}\right), \operatorname{info}\left(\pi_{2}\right), \ldots\right\}
$$

- Domain for computing $\operatorname{Collect}(t):\langle\wp(\mathcal{L}) ; \subseteq\rangle$


## Computing generating \& preserving runs

- L: local lock information from Kahlon \& Gupta
- Abstraction function: compute local lock information component-wise:

$$
\alpha\left(\left\{\pi_{1}, \pi_{2}, \cdots\right\}\right)=\left\{\operatorname{info}\left(\pi_{1}\right), \operatorname{info}\left(\pi_{2}\right), \ldots\right\}
$$

- Domain for computing $\operatorname{Collect}(t):\langle\wp(\mathcal{L}) ; \subseteq\rangle$
- Domain for computing Generating $/ \operatorname{Preserving}(t):\langle\wp(\mathcal{L} \times \mathcal{L}) ; \subseteq\rangle$
phase 1 phase 2


## One fact to many

- Domain for generating runs for a single fact: $\langle\wp(\mathcal{L} \times \mathcal{L}) ; \subseteq\rangle$


## One fact to many

- Domain for generating runs for a single fact: $\langle\mathcal{L} \times \mathcal{L} \rightarrow \mathbb{B} ; \preceq\rangle$


## One fact to many

- Domain for generating runs for a single fact: $\langle\mathcal{L} \times \mathcal{L} \rightarrow \mathbb{B} ; \preceq\rangle$
- Domain for generating runs for all facts: $\left\langle\mathcal{L} \times \mathcal{L} \rightarrow \mathbb{B}^{n} ; \preceq\right\rangle$


## One fact to many

- Domain for generating runs for a single fact: $\langle\mathcal{L} \times \mathcal{L} \rightarrow \mathbb{B} ; \preceq\rangle$
- Domain for generating runs for all facts: $\left\langle\mathcal{L} \times \mathcal{L} \rightarrow \mathbb{B}^{n} ; \preceq\right\rangle$
- Represent a function as a subset of $(\mathcal{L} \times \mathcal{L}) \times \mathbb{B}^{n}$; if $r \in \mathcal{L} \times \mathcal{L}$ doesn't appear in the representation, it is associated with $f f^{n}$.


## The algorithm

## (1) Sequential data flow analysis

## The algorithm

(1) Sequential data flow analysis
(2) Compute generating runs for each thread

## The algorithm

(1) Sequential data flow analysis
(2) Compute generating runs for each thread
(3) Build summaries

- Throw away "end" transitions for generating runs
- Join over all transitions $\Rightarrow$ Thread summary
- Join over all threads $\Rightarrow$ Program summary (parameterized systems)


## The algorithm

(1) Sequential data flow analysis
(2) Compute generating runs for each thread
(3) Build summaries

- Throw away "end" transitions for generating runs
- Join over all transitions $\Rightarrow$ Thread summary
- Join over all threads $\Rightarrow$ Program summary (parameterized systems)
(4) For each thread $T$ in the program:

For each transition $t$ in $T$ :
For each preserving run $\langle r, D\rangle$ reaching $t$ :
For each generating run $\left\langle r^{\prime}, D^{\prime}\right\rangle$ in the summary: If $r$ and $r^{\prime}$ can be interleaved, $D \cap D^{\prime}$ reaches $t$.

## Experiments

- Implementation applies to C with pthreads
- Ran reaching definitions on FUSE
- Inlined all functions
- (Unsound) alias analysis to finitize set of locks
- Split FUSE into chunks of $5,10,50,100,200,425$ functions
- Each function is considered a different thread


## Experiments



## Experiments



## Experiments



## Overview

Algorithm for computing the optimal solution to bitvector problems for concurrent programs communicating via nested locks

- Compositional: scales in \# of threads
- Scales in \# of data flow facts


## Questions?

Thank you for your attention.

