

The Yogi Project

Software property checking via verification and testing

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What is Yogi?

- An industrial strength program verifier
- **Philosophy**: Synergize verification and testing
- **Synergy** [FSE '06], **Dash** [ISSTA '08], **Smash** [POPL '10], **Bolt** [submitted] algorithms to perform scalable analysis
- Engineered a number of optimizations for scalability
- Integrated with Microsoft's Static Driver Verifier (**SDV**) toolkit and used internally

Property checking

```
void f(int *p, int *q)
{
0:  *p = 4;
1:  *q = 5;
2:  assert ( $\neg\varphi_{error}$ )
}
```

Question

Does the **assertion** hold for all possible inputs?



Must analysis: finds bugs, but can't prove their absence

May analysis: can prove the absence of bugs, but can result in false errors

More generally, we are interested in the **query**

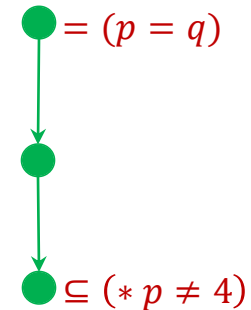
$$\langle \varphi_{pre} \stackrel{?}{\Rightarrow}_f \varphi_{error} \rangle$$

Must information

$\langle T \stackrel{?}{\Rightarrow}_f (*p \neq 4) \rangle = \text{yes}$

```
void f(int *p, int*q)
{
0:  *p = 4;
1:  *q = 5;
}
```

test



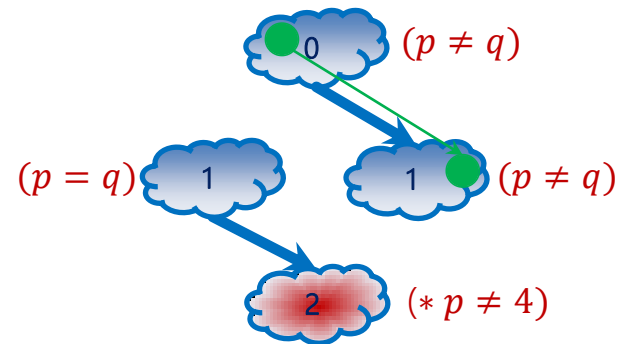
- Captures facts that are guaranteed to hold on particular executions of the program (*under-approximation*)
- Error condition is reachable by any input that satisfies $(p = q)$

May information

$\langle (p \neq q) \stackrel{?}{\Rightarrow}_f (*p \neq 4) \rangle = no$

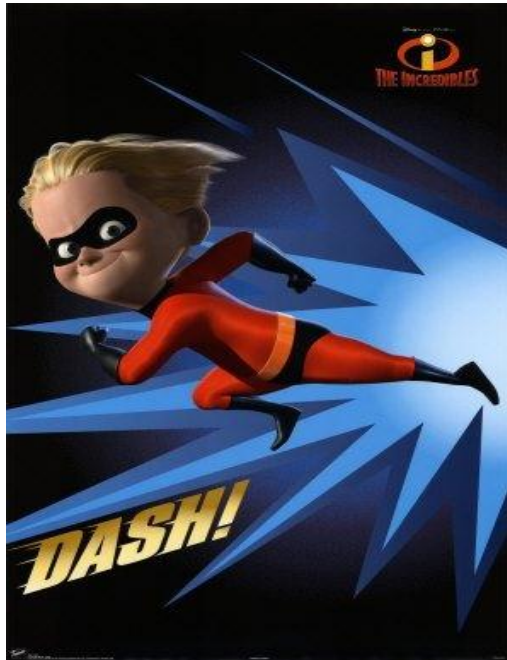
```
void f(int *p, int*q)
{
0:  *p = 4;
1:  *q = 5;
}
```

proof



- Captures facts that are true for all executions of the program (*over-approximation*)
- Proof can be obtained by keeping track of the predicates $(p = q)$ and $(*p \neq 4)$

Dash: Proofs from Tests

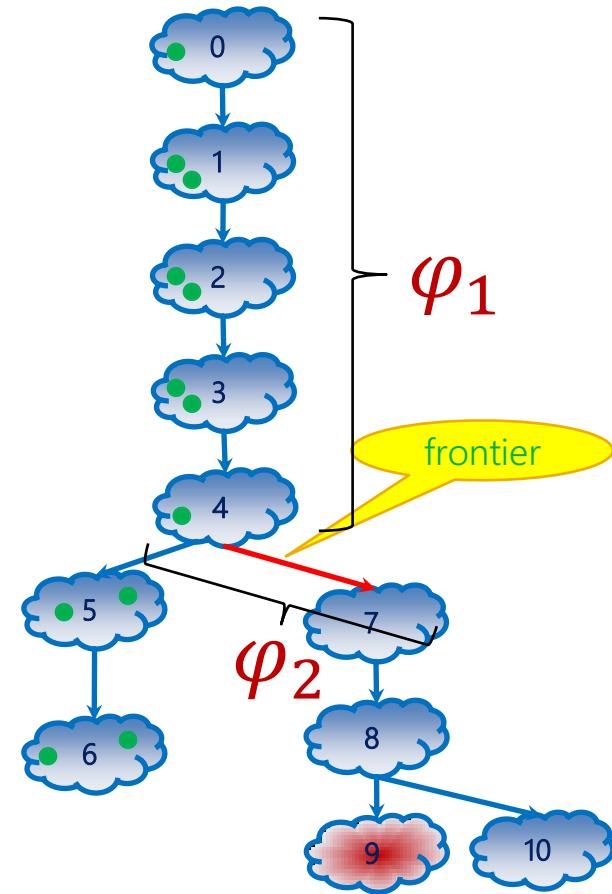


- Algorithm uses only test case generation operations
- Maintains two data structures:
 - A **forest** of reachable concrete states (tests)
 - Under-approximates executions of the program
 - A **region graph** (an abstraction)
 - Over-approximates all executions of the program
- **Our goal:** bug finding and proving
 - If a test reaches an error, we have found a bug
 - If we refine the abstraction so that there is ***no*** path from the initial region to error region, we have a proof
- **Key ideas**
 - **Frontier**
 - WP_α uses only aliases α that are present along concrete tests that are executed

Key ideas

Step 1: Try to generate a test that crosses the frontier

- Perform symbolic simulation on the path until the frontier and generate a constraint φ_1
- Conjoin with the condition φ_2 needed to cross frontier
- Is $\varphi_1 \wedge \varphi_2$ satisfiable?

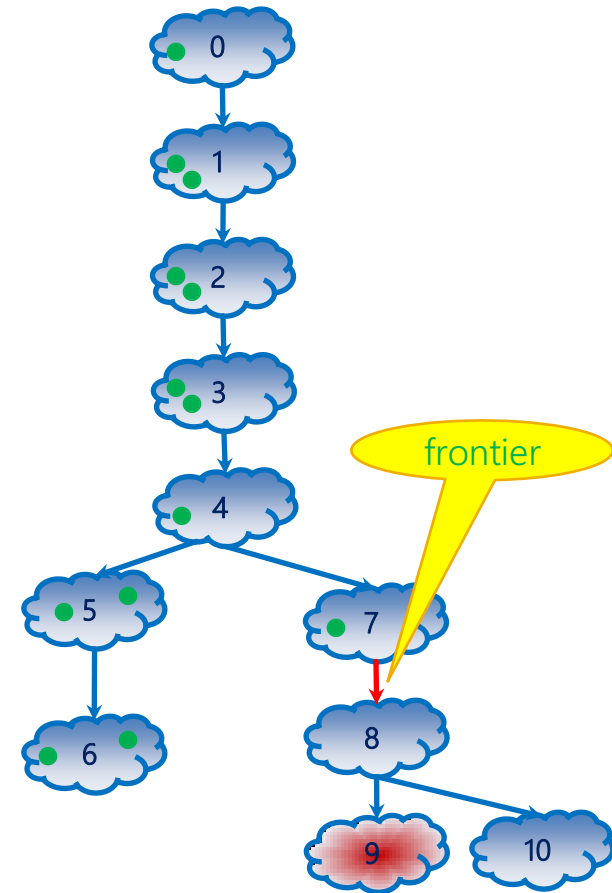


Key ideas

Step 1: Try to generate a test that crosses the frontier

- Perform symbolic simulation on the path until the frontier and generate a constraint φ_1
- Conjoin with the condition φ_2 needed to cross frontier
- Is $\varphi_1 \wedge \varphi_2$ satisfiable? [YES]

Step 2: run the test and extend the frontier

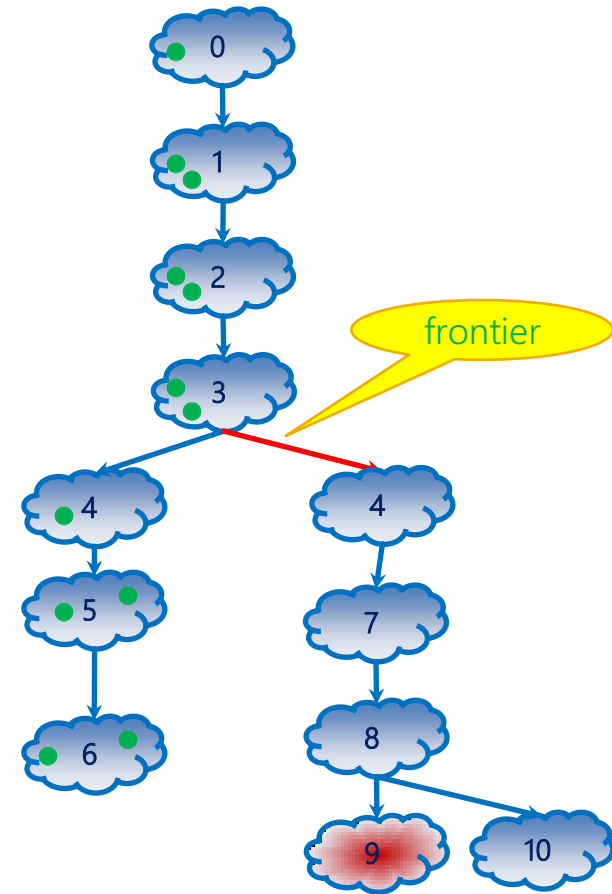


Key ideas

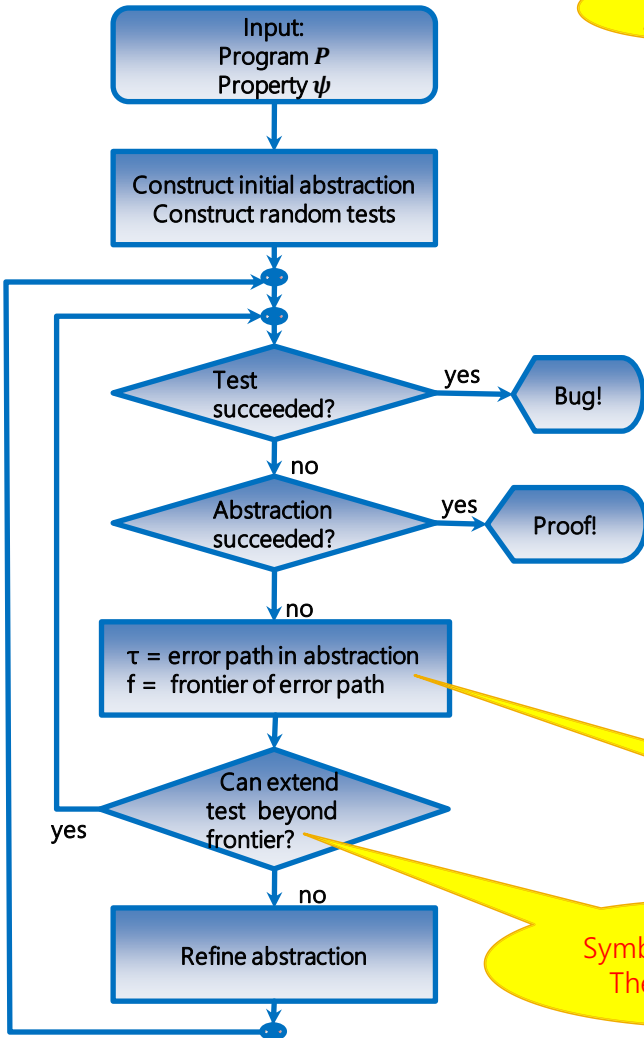
Step 1: Try to generate a test that crosses the frontier

- Perform symbolic simulation on the path until the frontier and generate a constraint φ_1
- Conjoin with the condition φ_2 needed to cross frontier
- Is $\varphi_1 \wedge \varphi_2$ satisfiable? [NO]

Step 2: use WP_α to refine so that the frontier moves back!



The Dash algorithm



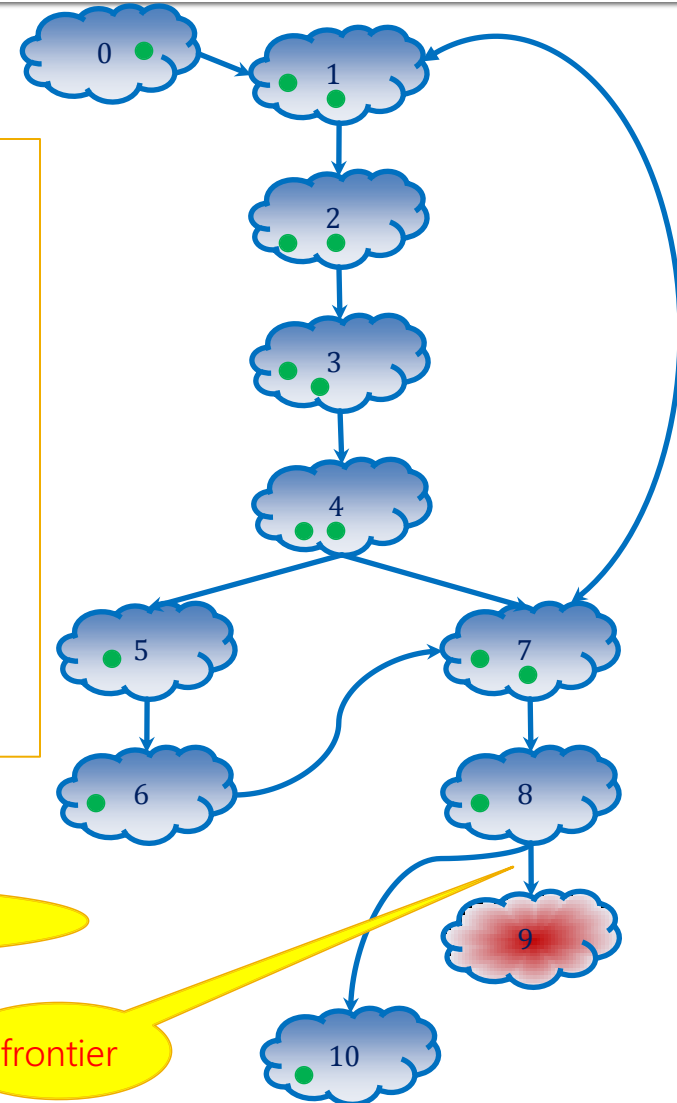
$y = 1$

```

void f(int y)
{
0:  int lock, x;
1:  do {
2:    lock = 1;
3:    x = y;
4:    if (*) {
5:      lock = 0;
6:      y = y+1;
7:    } while (x != y)
8:    if (lock != 1)
9:      error();
10: }
  
```

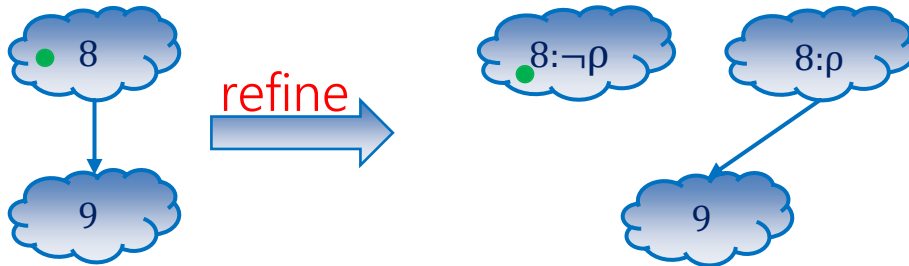
$\tau = (0,1,2,3,4,7,8,9)$

Symbolic execution +
Theorem proving

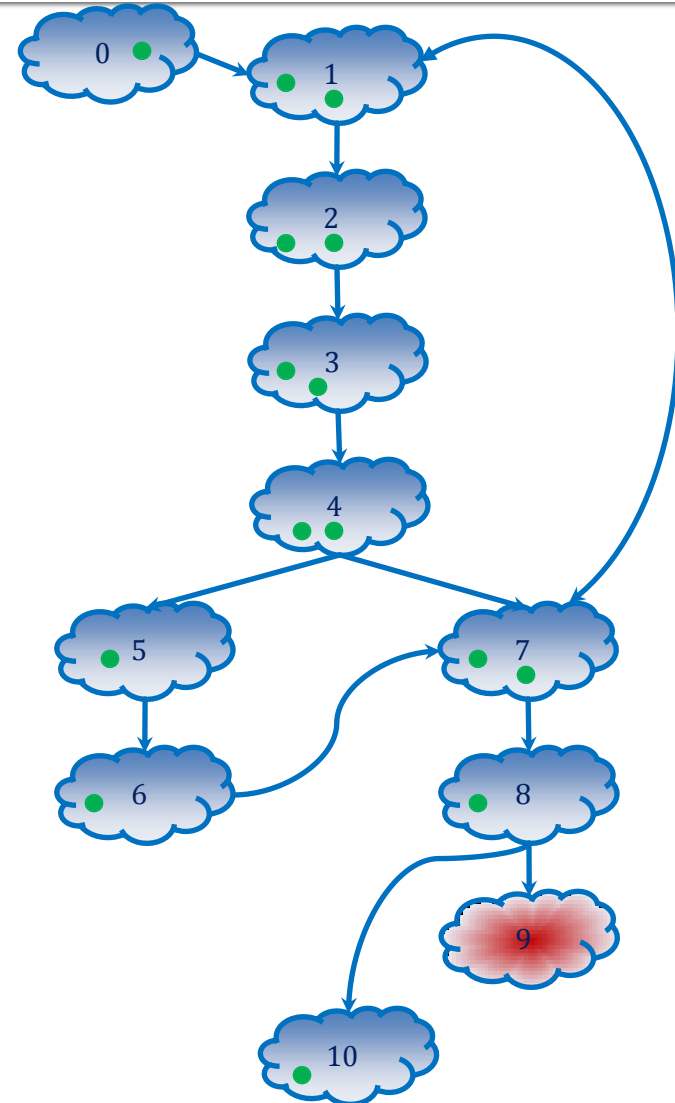


frontier

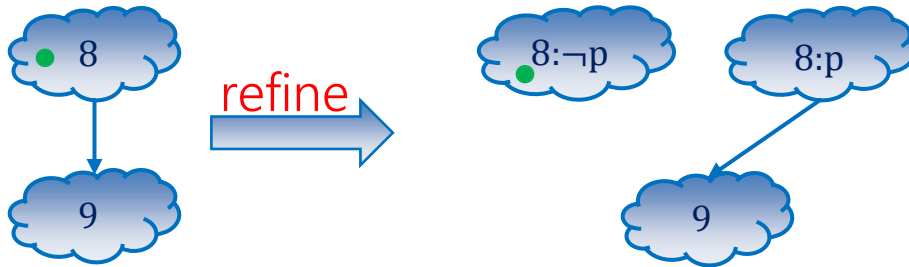
Refinement



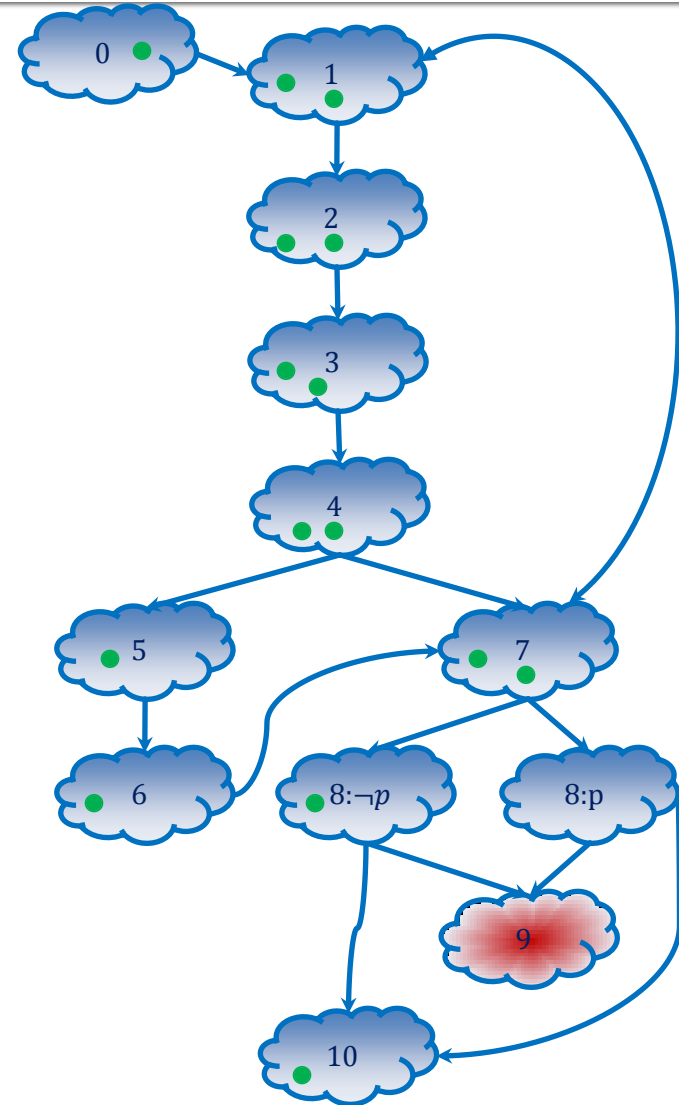
$\rho = (\text{lock.state} \neq L)$



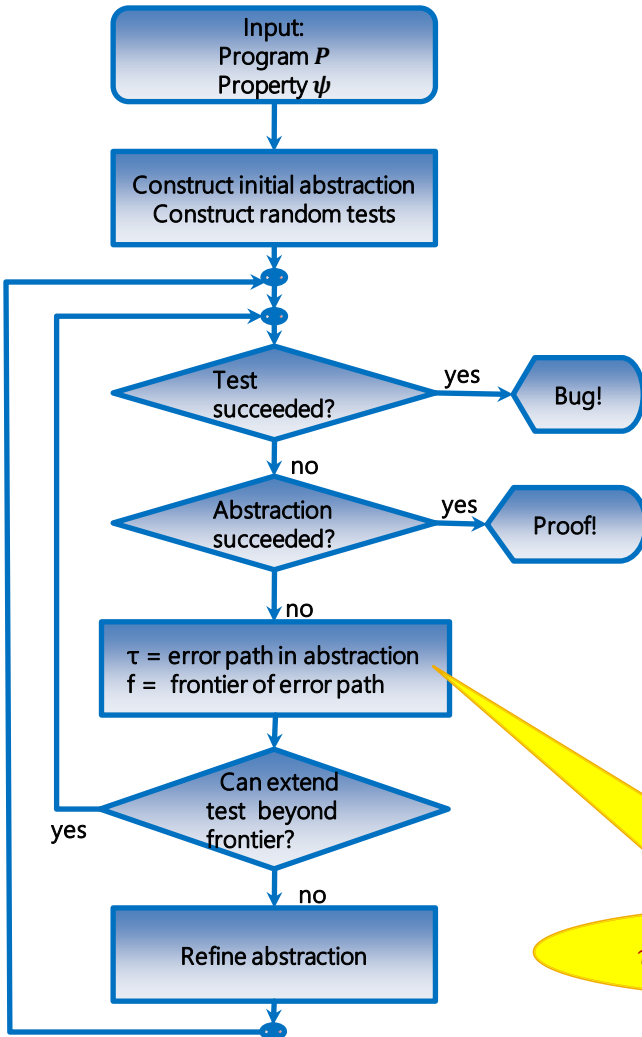
Refinement



$p = (\text{lock.state} \neq L)$

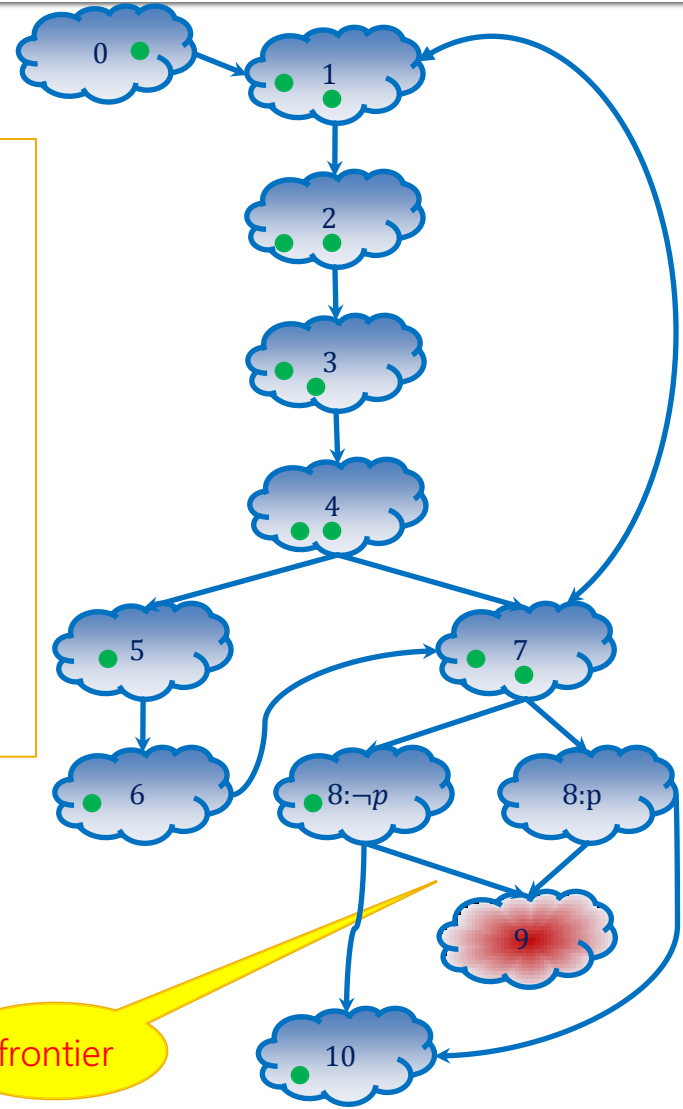


Another iteration



```

void f(int y)
{
0:  int lock, x;
1:  do {
2:    lock = 1;
3:    x = y;
4:    if (*) {
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6:      y = y+1;
7:    } while (x != y)
8:    if (lock != 1)
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10: }
  
```



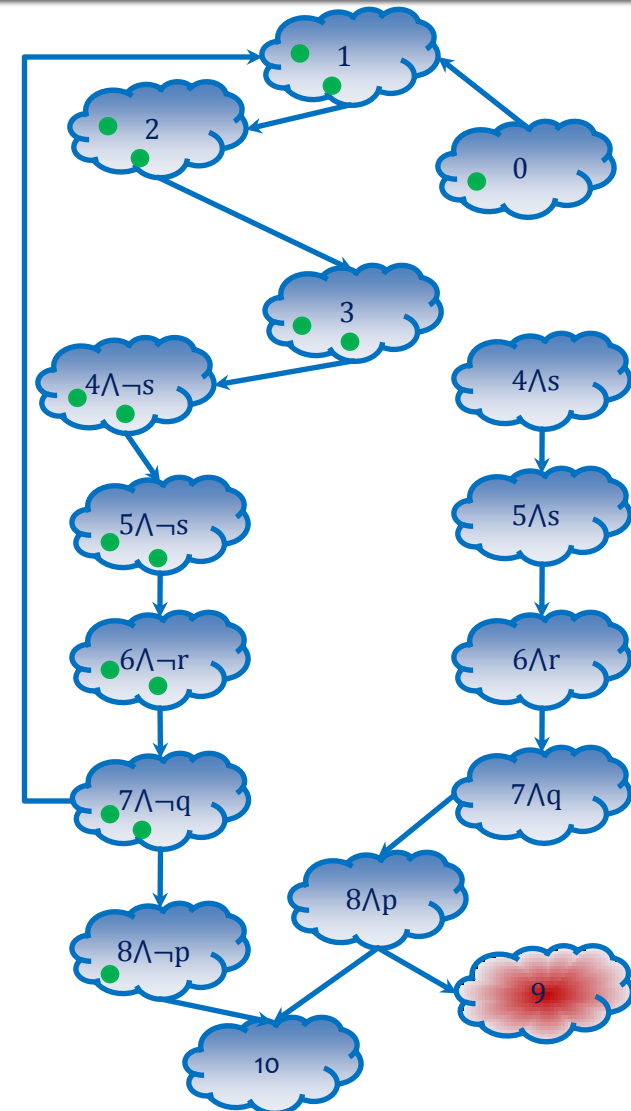
$\tau = (0,1,2,3,4,7, \langle 8, p \rangle, 9)$

frontier

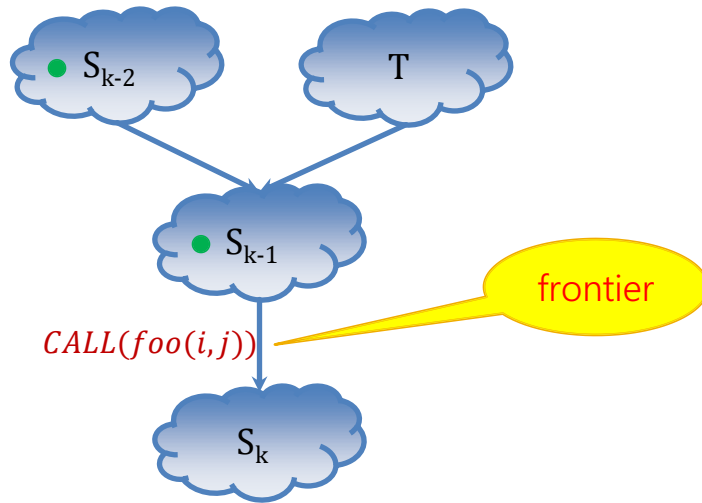
Correct, the program is ...



```
void f(int y)
{
0:  int lock, x;
1:  do {
2:    lock = 1;
3:    x = y;
4:    if (*) {
5:      lock = 0;
6:      y = y+1;
    }
7:  } while (x != y)
8:  if (lock != 1)
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```



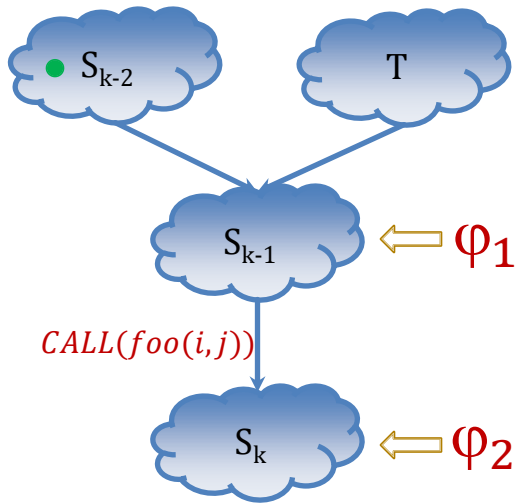
Interprocedural analysis



Key idea

Perform a recursive Dash query on the called procedure and use the result to either generate a test or compute WP_α

Interprocedural analysis



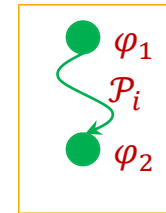
$\text{Dash}\langle \varphi_1 \stackrel{?}{\Rightarrow}_{foo} \varphi_2 \rangle$

- pass: perform refinement
- fail: generate test

Procedure summaries

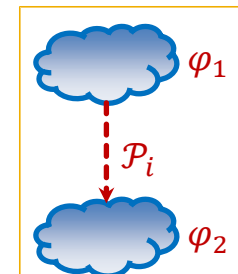
- A *must summary* for a procedure \mathcal{P}_i is of the form $(\varphi_1, \varphi_2) \in \xRightarrow{\text{must}}_{\mathcal{P}_i}$
- $\forall t \in \varphi_2 . \exists s \in \varphi_1 . t$ can be obtained by executing \mathcal{P}_i from an initial state s

must summary



- A *\neg may summary* for a procedure \mathcal{P}_i is of the form $(\varphi_1, \varphi_2) \in \xRightarrow{\neg\text{may}}_{\mathcal{P}_i}$
- $\forall s \in \varphi_1 \forall t \in \varphi_2 . t$ cannot be obtained by executing \mathcal{P}_i starting in state s

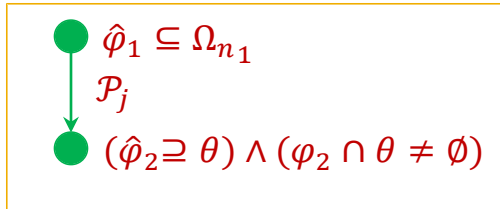
\neg may summary



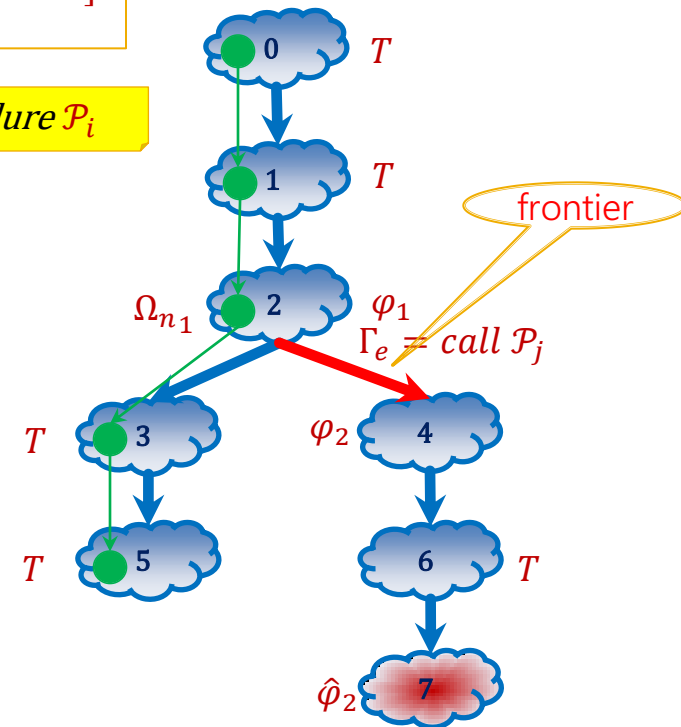
Compositional may-must analysis

$$\begin{array}{l}
 \varphi_1 \in \Pi_{n_1} \quad \varphi_2 \in \Pi_{n_2} \quad \varphi_1 \cap \Omega_{n_1} \neq \emptyset \quad \varphi_2 \cap \Omega_{n_2} = \emptyset \\
 e = (n_1, n_2) \in E_{\mathcal{P}_i} \text{ is a call to procedure } \mathcal{P}_j \\
 \frac{(\hat{\varphi}_1, \hat{\varphi}_2) \in \xrightarrow{\text{must}}_{\mathcal{P}_j} \quad \Omega_{n_1} \supseteq \hat{\varphi}_1 \quad \theta \subseteq \hat{\varphi}_2 \quad \varphi_2 \cap \theta \neq \emptyset}{\Omega_{n_2} := \Omega_{n_2} \cup \theta} \quad [\text{MUST - POST - USESUM}]
 \end{array}$$

must summary



procedure \mathcal{P}_i



- Check if frontier (n_1, n_2) can be extended by a *must summary* $(\hat{\varphi}_1, \hat{\varphi}_2)$
- If yes, grow Ω_{n_2} with $\theta \subseteq \hat{\varphi}_2$

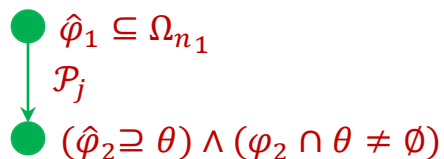
Compositional may-must analysis

$\varphi_1 \in \Pi_{n_1}$ $\varphi_2 \in \Pi_{n_2}$ $\varphi_1 \cap \Omega_{n_1} \neq \emptyset$ $\varphi_2 \cap \Omega_{n_2} = \emptyset$

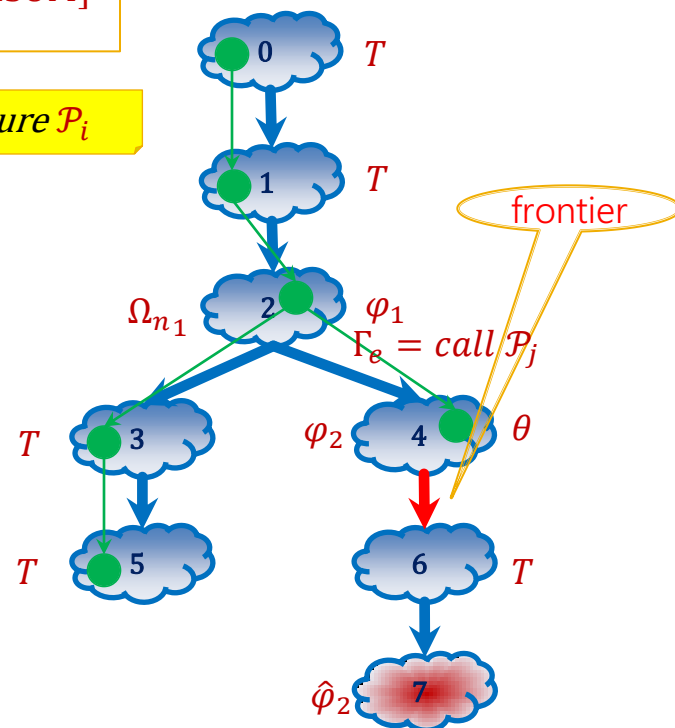
$e = (n_1, n_2) \in E_{\mathcal{P}_i}$ is a call to procedure \mathcal{P}_j

$$\frac{(\hat{\varphi}_1, \hat{\varphi}_2) \in \xrightarrow{\text{must}}_{\mathcal{P}_j} \Omega_{n_1} \supseteq \hat{\varphi}_1 \quad \theta \subseteq \hat{\varphi}_2 \quad \varphi_2 \cap \theta \neq \emptyset}{\Omega_{n_2} := \Omega_{n_2} \cup \theta} \quad [\text{MUST - POST - USESUM}]$$

must summary



procedure \mathcal{P}_i



- Check if frontier (n_1, n_2) can be extended by a *must summary* $(\hat{\varphi}_1, \hat{\varphi}_2)$
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Compositional may-must analysis

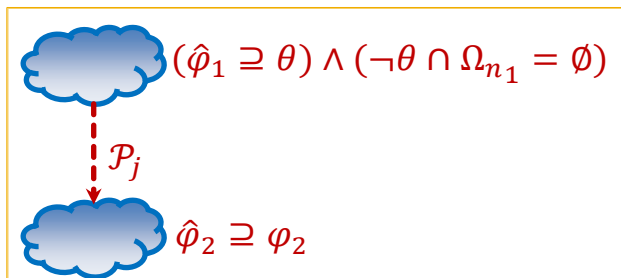
$\varphi_1 \in \Pi_{n_1}$ $\varphi_2 \in \Pi_{n_2}$ $\varphi_1 \cap \Omega_{n_1} \neq \emptyset$ $\varphi_2 \cap \Omega_{n_2} = \emptyset$

$e = (n_1, n_2) \in E_{\mathcal{P}_i}$ is a call to procedure \mathcal{P}_j

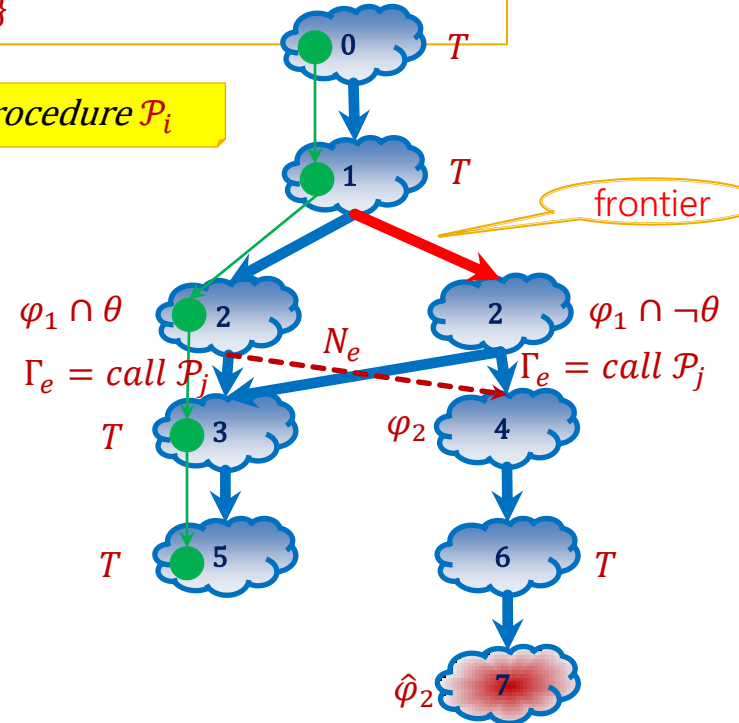
$\langle \hat{\varphi}_1, \hat{\varphi}_2 \rangle \in \xrightarrow{\neg\text{may}}_{\mathcal{P}_j}$ $\varphi_2 \subseteq \hat{\varphi}_2$ $\theta \subseteq \hat{\varphi}_1$ $\neg\theta \cap \Omega_{n_1} = \emptyset$

$\Pi_{n_1} := (\Pi_{n_1} \setminus \{\varphi_1\}) \cup \{\varphi_1 \cap \theta, \varphi_1 \cap \neg\theta\}$ $N_e := N_e \cup \{(\varphi_1 \cap \theta, \varphi_2)\}$ [NMAY – PRE – USESUM]

$\neg\text{may}$ summary



procedure \mathcal{P}_i



- Check if frontier (n_1, n_2) can be refined by a $\neg\text{may}$ summary $(\hat{\varphi}_1, \hat{\varphi}_2)$
- If yes, use $\theta \subseteq \hat{\varphi}_1$ to refine the abstraction
- If both *must* and $\neg\text{may}$ summaries are not available, analyze procedure \mathcal{P}_j
 - *yes* \Rightarrow *must* summary for \mathcal{P}_j
 - *no* \Rightarrow $\neg\text{may}$ summary for \mathcal{P}_j

Optimizations

- Engineering for making **Yogi** robust, scalable and industrial strength
- Several of the implemented optimizations are folklore
 - Very difficult to design tools that are bug free \Rightarrow evaluating optimizations is hard!
 - Our empirical evaluation gives tool builders information about what gains can be realistically expected from optimizations
 - Details in **ICSE '10**
- Vanilla implementation of algorithms:
 - (`f1pydisk`, `cancelspinlock`) took 2 hours
- Algorithms + engineering + optimizations:
 - (`f1pydisk`, `cancelspinlock`) took less than 1 second!

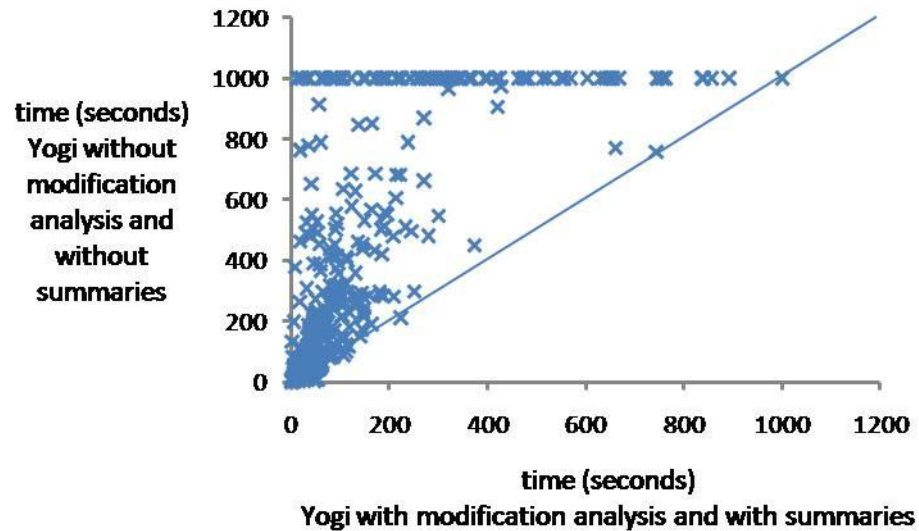
Evaluation setup

- Benchmarks:
 - 30 WDM drivers and 83 properties (2490 runs)
 - Anecdotal belief: most bugs in the tools are usually caught with this test suite

Empirical results (Summaries)

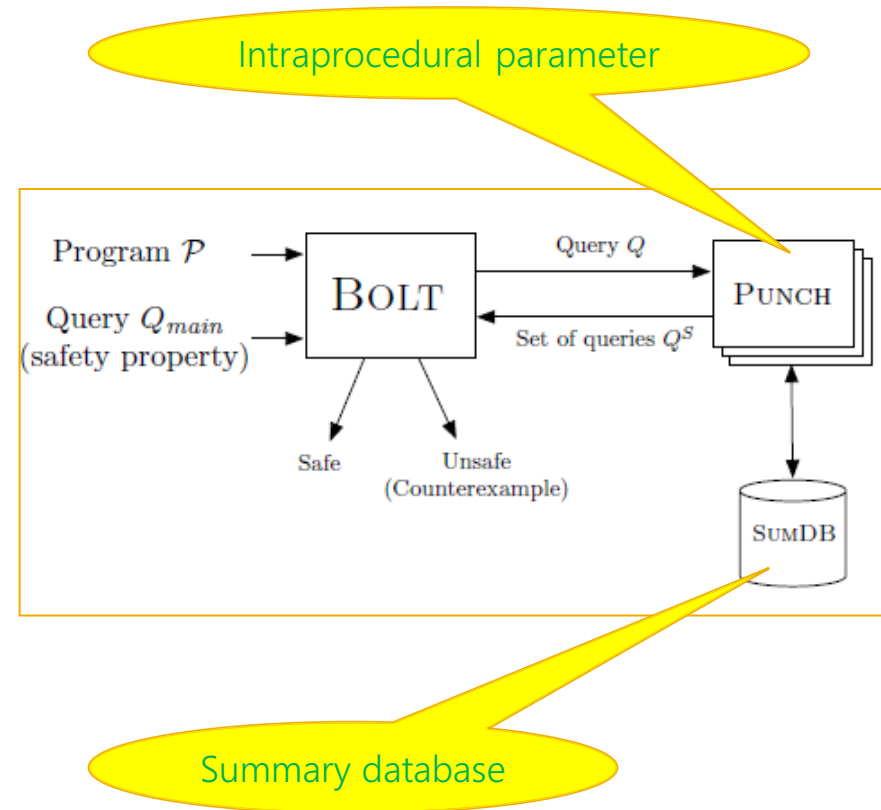
Summaries	Total time (minutes)	#defects	#timeouts
yes	2160	241	77
no	3780	236	165

42%



Current research

- **Bolt**: a generic framework that uses MapReduce style parallelism to scale top-down analysis



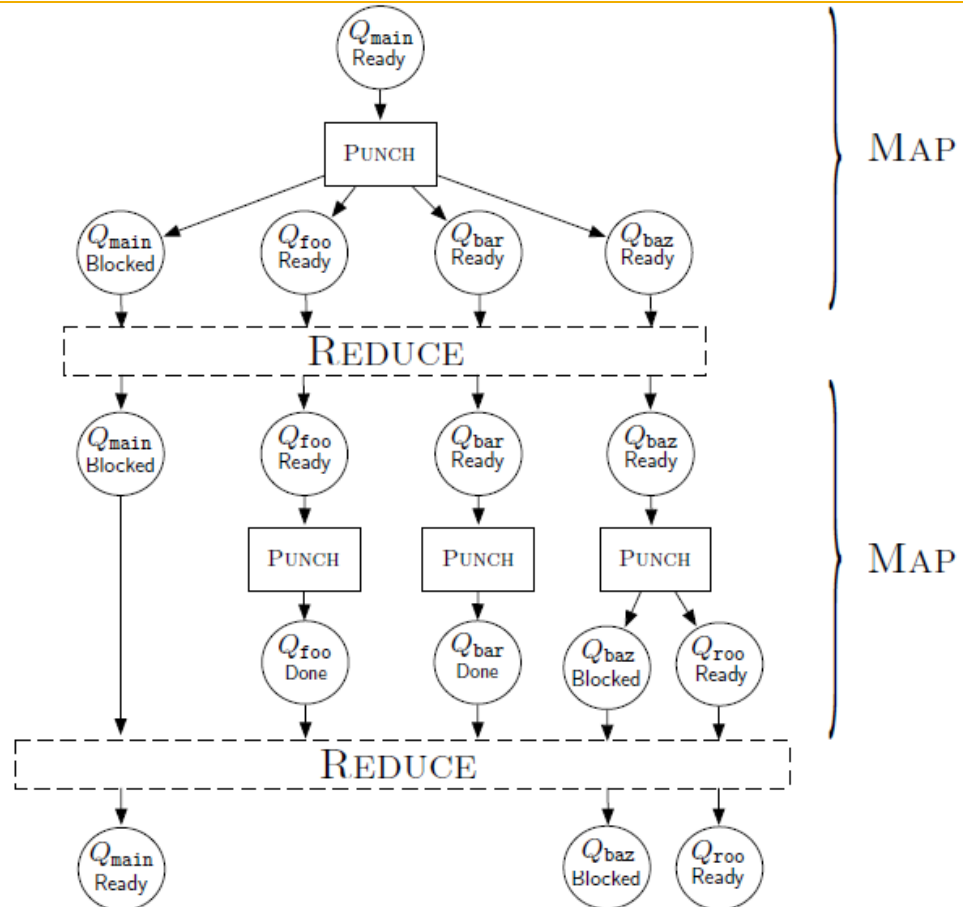
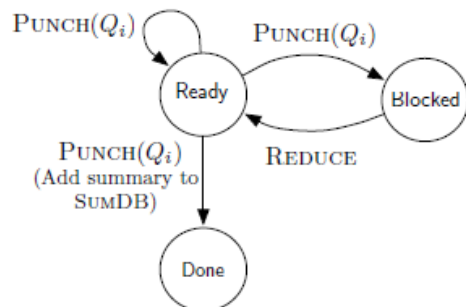
Example

```
int foo(int p_foo);
int bar(int p_bar);
int baz(int p_baz);
```

```
main(int i, int j){
  int x, y;
  if (j > 0)
    x = foo(i);
  else if (j > -10)
    x = bar(i);
  else
    x = baz(j);

  y = x + 5;
  assert(y > 0);
}
```

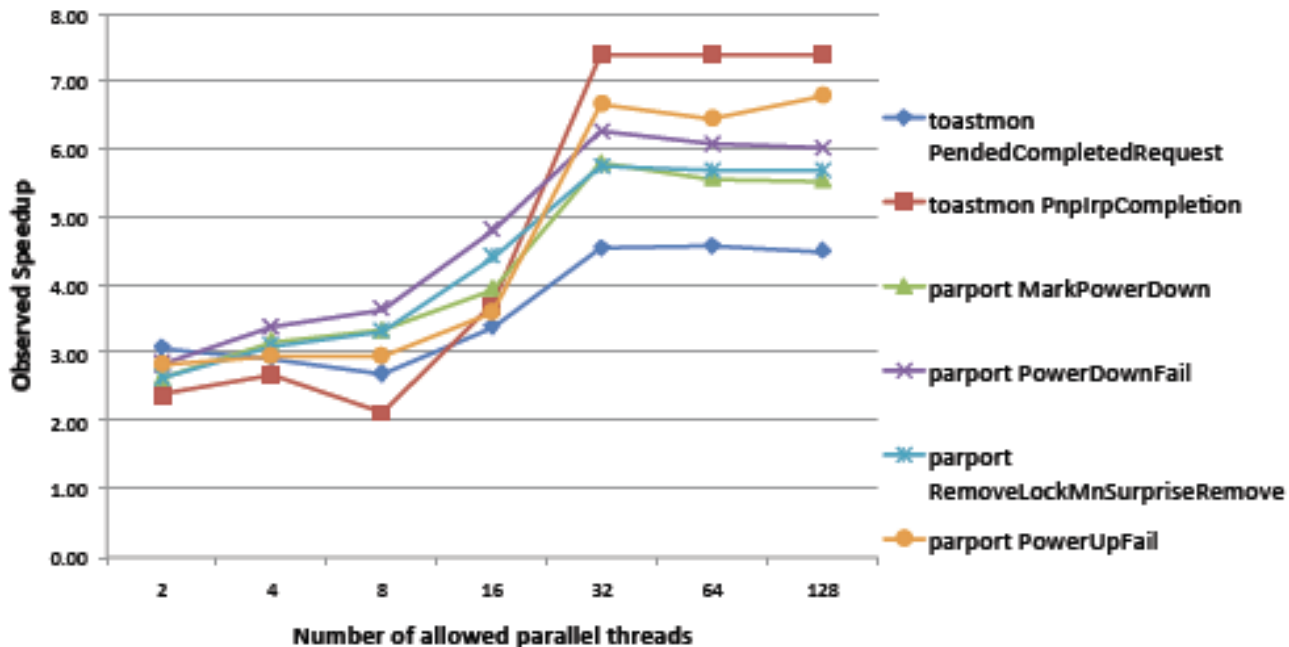
(a)



Empirical results

~Linear speedup!

Statistic	
Total time taken (sequential)	26 hours
Total time taken (parallel)	7 hours
Average observed speedup	3.71x
Maximum observed speedup	7.41x



Questions?



PLDI 2012 tutorial

<http://research.microsoft.com/yogi/pldi2012.aspx>