

# Absynth\*

## Bounded Expectations: Resource Analysis for Probabilistic Programs

Van Chan Ngo

Carnegie Mellon University

# Overview

- Static analysis for deriving **bounds on the expected resource usage** of probabilistic programs
- **Fully automated** using off-the-shelf LP solving
- Multivariate **polynomial bounds** on the inputs
- Prototype implementation and benchmark design\*

\*available upon request at [channgo@cmu.edu](mailto:channgo@cmu.edu)

# Simple Programs

Current position

Boundary

```
int x, n;
x = 0;
while (x < n) {
    x = x + 1
    [3/4]
    x = x - 1;
    tick(1);
}
```

Cost 1 time unit

Simulates a **random walk** that ends when the walker passes the boundary

Each time unit:

- Goes forward 1 step with  $p = 3/4$
- Goes backward 1 step with  $p = 1/4$

What is the **expected value of elapsed time**?

# Simple Programs

Current position

Boundary

```
int x, n;  
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Simulates a **random walk** that ends when the walker passes the boundary

Each time unit:

- Goes forward with  $p = 3/4$
- Goes backward with  $p = 1/4$

$2\max(0, n - x)$

What is the **expected value of elapsed time**?

# Trapped Miner

0: safety, 1:  
otherwise

number of  
independent sending

```
int flag, n;  
while (n > 0) {  
  { flag = 1;  
  while (flag > 0) {  
    { flag = 0; tick(3) }  
    [1/3]  
    { {flag = 1; tick(5)}  
      [1/2]  
      {flag = 1; tick(7);} }  
    }  
  }  
  [1/2]  
  skip;  
  n = n - 1;  
}
```

number of hours in  
channel

A miner is sent to a mine  $n$  time independently

With  $p = 1/2$ , the miner is trapped

When being trapped, 3 doors to open

- Door 1: takes 3 hours to safety
- Door 2: takes 5 hours to the mine
- Door 3: takes 7 hours to the mine

What is the expected time to reach safety?

# Trapped Miner

0: safety, 1:  
otherwise

number of  
independent sending

```
int flag, n;  
while (n > 0) {  
  { flag = 1;  
  while (flag > 0) {  
    { flag = 0; tick(3) }  
    [1/3]  
    { {flag = 1; tick(5)}  
      [1/2]  
      {flag = 1; tick(7);} }  
    }  
  }  
  [1/2]  
  skip;  
  n = n - 1;  
}
```

number of hours in  
channel

A miner is sent to a mine  $n$  time independently

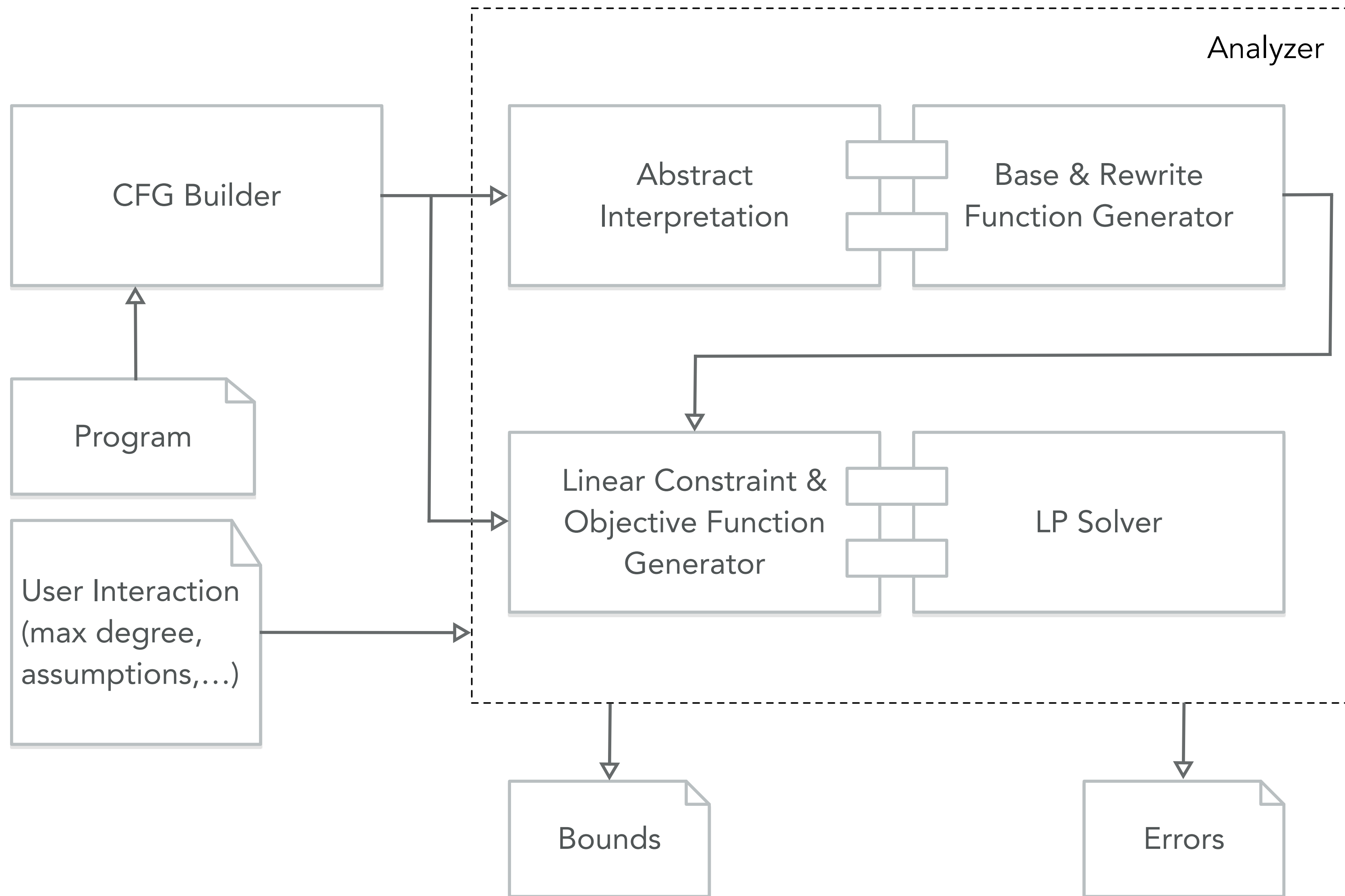
With  $p = 1/2$ , the miner is trapped

When being trapped, 3 doors to open

- Door 1: takes 3 hours to safety
- Door 2:  $7.5\max(0, n)$  the mine
- Door 3:  $7.5\max(0, n)$  the mine

What is the expected time to reach safety?

# Architecture



Base Functions

$$M := \mathbf{1} \mid x \mid M_1 \cdot M_2 \mid \max(0, P)$$

Potential & Rewrite Functions

$$P := k \cdot M \mid P_1 + P_2$$

```

1 while (x < n) {
2   x = x + 1
3   [3/4]
4   x = x - 1;
5   tick(1);
6 } //termination point

```

$c1 [p] c2$  : probabilistic branching

$id = e \text{ bop } R$  : sampling assignment  
 $R$  is probability distribution

$if * c1 \text{ else } c2$  : non-deterministic choice

