

## Outline

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## 1 Motivation

### 1.1 Extension to Probabilistic B

#### Extending Probabilistic B

- To extend the scope of *probabilistic B* ( $pB$ ) to layered developments;
- Need to introduce *probabilistic specification substitution*;
- To extend *Abstract Machine Notation* ( $AMN$ ) to express
  - probabilistic specification substitution;
  - probabilistic invariant (*expectation*) for loops.

#### Changing the B-Toolkit

We have adapted the *B-Toolkit* to assist the development of  $pB$  machines. This involves:

- new syntax;
- proof obligation generation for new constructs;
- reasoning over *real* as well as Boolean.

### 1.2 Background

#### Probabilistic Generalised Substitution Language

#### Summary

$[x : = E]exp$	The expectation obtained after replacing all free occurrences of $x$ in $exp$ by $E$
$[skip]exp$	$exp$
$[prog_1 \text{ } p \oplus prog_2]exp$	$p \times [prog_1]exp + (1-p) \times [prog_2]exp$
$prog_1 \sqsubseteq prog_2$	$[prog_1]exp \Rightarrow [prog_2]exp$
$[prog_1 \parallel prog_2]exp$	$[prog_1]exp \min [prog_2]exp$
$[@y \cdot pred \Rightarrow prog]exp$	$\min (y) \cdot (pred \mid [prog]exp)$

## How *pGSL* extends *GSL*

### Expectations replace predicates

*Predicates* (functions from state to Boolean) are widened to *Expectations* (functions from state to real).

- For consistency with Boolean logic, we use *embedded predicates*,  $\langle false \rangle = 0$ , and  $\langle true \rangle = 1$ .
- Notationally, we have kept predicates as much as possible.

## 2 Our Results/Contribution

### 2.1 Probabilistic specification substitution

#### Syntax

We want to have a definition in the probabilistic world which is similar to the precondition, postcondition pair.

#### Standard substitution

$v : \{P, Q\}$ , where  $P$  and  $Q$  are predicates over the state,  $x$ .

- $v \subseteq x$
- $Q$  can refer to the original state by using subscripted variables  $x_0$ .

#### Probabilistic substitution

$v : \{A, B\}$ , where  $A$  and  $B$  are *expectations over state*.

The expected value of  $B$  over the set of final distributions is at least the expected value of  $A$  over the initial distribution.

#### Semantics

#### Program

Specification  $v : \{A, B\}$ .

#### Post-expectation

Arbitrary expectation  $C$ .

### Questions?

What is  $[v : \{A, B\}] C$ ?

### Semantics of probabilistic substitution

$$[v : \{A, B\}] C \hat{=} A \times [x_0 := x] \left( \prod x \cdot \left( \frac{C}{B \times \langle w = w_0 \rangle} \right) \right)$$

(with  $w$  is the set of unchanged variables, i.e.  $x - v$ ).

(Similar work can be seen in White[1996] and Ying[2003])

### Example

#### Program $prog_1$

$$prog_1 \hat{=} c : \left\{ \frac{1}{2}, \langle c = H \rangle \right\}.$$

#### Post-expectation $\langle c = H \rangle$

$$\begin{aligned} & [c : \left\{ \frac{1}{2}, \langle c = H \rangle \right\}] \langle c = H \rangle \\ \equiv & \frac{1}{2} * [c_0 := c] \left( \prod c \cdot \left( \frac{\langle c = H \rangle}{\langle c = H \rangle} \right) \right) \\ \equiv & \frac{1}{2} * [c_0 := c] 1 \\ \equiv & \frac{1}{2} \end{aligned}$$

## 2.2 Fundamental theorem

### Theorem

**Standard Theorem 0.1.** Assume that  $prog_1 \hat{=} v : \{P, Q\}$ .

For any program  $prog_2$ ,  $prog_1 \sqsubseteq prog_2$  if and only if

$$P \implies [x_0 := x] [prog_2] Q^w,$$

where  $Q^w \hat{=} Q \wedge w = w_0$ .

**Probabilistic Theorem 0.1.** Assume that  $prog_1 \hat{=} v : \{A, B\}$ .

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where  $B^w \hat{=} B \times \langle w = w_0 \rangle$ .

## Example

### Programs $prog_1$ and $prog_2$

Consider  $prog_1$  and  $prog_2$  as follows:

$$prog_1 \hat{=} c : \left\{ \frac{1}{2}, \langle c = H \rangle \right\}, \quad prog_2 \hat{=} c : = H \frac{1}{2} \oplus c : = T.$$

### $prog_1 \sqsubseteq prog_2?$

$$\begin{aligned} & [c_0 := c] \left[ c : = H \frac{1}{2} \oplus c : = T \right] \langle c = H \rangle \\ \equiv & \frac{1}{2} \times [c : = H] \langle c = H \rangle \\ & + \left(1 - \frac{1}{2}\right) \times [c : = T] \langle c = H \rangle \\ \equiv & \frac{1}{2} \times \langle H = H \rangle + \frac{1}{2} \times \langle T = H \rangle \\ \equiv & \frac{1}{2}. \end{aligned}$$

## 2.3 Proof Obligations for Loops

### Standard rules

For a standard loop, such as

$$loop \hat{=} \text{WHILE } G \text{ DO } S \text{ INVARIANT } I \text{ VARIANT } V \text{ END},$$

then  $P \implies [init; loop]Q$  holds if the following are satisfied:

$$\begin{array}{lll} S1 & P & \implies [init]I \\ S2 & G \wedge I & \implies [S]I \\ S3 & \neg G \wedge I & \implies Q \\ S4 & I & \implies V \in \mathbb{N} \\ S5 & G \wedge I & \implies [n := V][S](V < n) \end{array}$$

### Probabilistic rules

For a probabilistic loop, such as

$$loop \hat{=} \text{WHILE } G \text{ DO } S \text{ INVARIANT } I \text{ EXPECTATION } E \text{ VARIANT } V \text{ END}.$$

then  $\langle P \rangle * A \implies [init; loop](\langle Q \rangle * B)$  holds if the following satisfies:

$$\begin{array}{lll} P1 & \langle P \rangle * A & \implies [init](\langle I \rangle * E) \\ P1a & P & \implies [init]I \\ P1b & \langle P \rangle * A & \implies [init]E \\ \hline P2 & \langle G \wedge I \rangle * E & \implies [S](\langle I \rangle * E) \\ P2a & G \wedge I & \implies [S]I \\ P2b & \langle G \wedge I \rangle * E & \implies [S]E \\ \hline P3 & \langle \neg G \wedge I \rangle * E & \implies \langle Q \rangle * B \\ P3a & \neg G \wedge I & \implies Q \\ P3b & \langle \neg G \wedge I \rangle * E & \implies B \\ \hline P4 & I & \implies V \in \mathbb{N} \\ P5 & G \wedge I & \implies [n := V][S](V < n) \end{array}$$

The difference with the previous work is that there's a clear separation between  $I$  and  $E$ .

## 2.4 Case Study

### Description of Min-Cut algorithm

#### *Aims*

- Probabilistic fundamental theorem in practice.
- Developing probabilistic system in layers.
- Analysing some of the unexpected and subtle issues.

#### **Two phases**

The algorithm is used to find the minimum cut for a connected indirect graph:

- A *cut* is a set of edges such that if we remove just those edges, the graph will become disconnected;
- A *minimum* cut is a cut with the least number of edges.

The algorithm contains two phases: *Contraction sequences* and *probabilistic amplification*.

#### **Contraction sequences**

##### **Description**

- In a *contraction step*, two connected nodes are chosen randomly and merge together.
- The probability that any specific minimum cut is kept is at least

$$\frac{N-2}{N},$$

where  $N$  is the number of nodes in the current graph.

- This step is repeated until there are two nodes left, the edges connecting the last two nodes will be the cut chosen.
- Overall, the probability that the last cut is minimum cut is at least

$$p(N) = \frac{N-2}{N} \times \frac{N-3}{N-1} \times \dots \times \frac{2}{4} \times \frac{1}{2} = \frac{2}{N \times (N-1)}.$$

## Formal development of contraction

### Specification

$ans \leftarrow \text{contraction}(N) \hat{=} ans : \{\langle pre1 \rangle * p(N), \langle ans \rangle\}$

### Implementation

$ans \leftarrow \text{contraction}(N) \hat{=}$   
**VAR**  $n$  **IN**  
   $n := N; ans := TRUE;$   
  **WHILE**  $2 < n$  **DO**  $ans \leftarrow \text{merge}(n, ans); n := n - 1$  **END**  
**END**

### *merge* operation

$ans \leftarrow \text{merge}(n, a) \hat{=}$   
 $n \in \mathbb{N} \wedge a \in \text{BOOL} \quad | \quad ans := FALSE \leq_{\frac{2}{n}} \oplus a$

## Proof obligations of contraction

Here is the summary of proof obligations for the implementation generated by the modified *B-Toolkit*:

### Summary

Total	Auto Prove	BTool Prove
14	11	3

## Probabilistic amplification

### Description

- We repeat the contraction sequences to increase the chance of finding the right minimum cut.
- Assume that we do that  $M$  times, the probability of finding the right minimum cut is at least:

$$P(N, M) = 1 - (1 - p(N))^M .$$

## Formal development of probabilistic amplification

### Specification

$ans \leftarrow \text{minCut}(N, M) \hat{=} ans : \{\langle pre2 \rangle * P(N, M), \langle ans \rangle\}$

### Implementation

```

ans ← minCut( N, M ) ≐
VAR m, a IN
  m := M; ans := FALSE;
  WHILE m ≠ 0 DO
    a ← contraction(N);
    ans := ans ∨ a;
    m := m - 1
  END
END

```

### Proof obligations of probabilistic amplification

Here is the summary of proof obligations for probabilistic amplification produced by the modified *B-Toolkit*:

#### Summary

Total	Auto Prove	BTool Prove
14	13	0

#### Problem?

There is one proof obligation that cannot be proved.

#### Solution

The problem observed is due to the fact that in the definition for probabilistic specification substitution, we *did not specify termination*.

In *B*, termination of all programs must be proved, so we should introduce *terminating probabilistic specification substitution* and its *fundamental theorem*.

#### Summary

- *Abstractly specify and refine* probabilistic system.
- Development can be separated into *layers*.
- *Termination* condition is checked when developing systems using the *B-Toolkit*.

- Future work
  - Multiple expectations.
  - Fundamental theorem for refining system with multiple expectations.

## References

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