

# Resource Analysis

## Lecture 4

June 22, 2019

### 1 Recap: Soundness

**Theorem 1.1** (Progress). *If  $\vdash_{q'}^q e : \tau$  and  $p \geq q$  then either  $e$  is a value or  $\exists e', p'$  s.t.  $\langle e, p \rangle \mapsto \langle e', p' \rangle$ .*

**Theorem 1.2** (Preservation). *If  $\vdash_{q'}^q e : \tau$ ,  $p \geq q$  and  $\langle e, p \rangle \mapsto \langle e', p' \rangle$  then  $\vdash_{q'}^{p'} e' : \tau$ .*

*Proof notes.* Proved by nested induction on  $\vdash_{q'}^q e : \tau$  and  $\langle e, p \rangle \mapsto \langle e', p' \rangle$ .  $\square$

**Alternative soundness theorem:** Recall the judgement  $V \vdash e \Downarrow v \mid (q, q')$

**Definition 1.2.1.**  $\phi(V : \Gamma) = \sum_{x \in \text{dom}(\Gamma)} \phi(V(x) : \Gamma(x))$

where  $\Gamma$  assigns types to variables.

**Theorem 1.3.** *Let  $V : \Gamma$  and  $\vdash_{q'}^q e : \tau$  and  $V \vdash e \Downarrow v \mid (p, p')$  then  $\phi(V : \Gamma) + q \geq p$  and  $\phi(V : \Gamma) + q - \phi(v : \tau) - q' \geq p - p'$*

This theorem shows that the type derivation is a certificate for bound correctness.

### 2 Type inference

**Example 1.** *We want to find a derivation for:*

$\vdash_0^0 \text{fix}(id. \lambda(x : L(unit)) \text{ mat} L(x; nil; y, ys.\text{cons}(y; \text{tick}\{2\}(id(ys)))) : L^2(unit) \rightarrow^{0/0} L^0(unit)$

See figure 2 for the derivation tree.

For type inference we need algorithmic (or syntax-directed) rules. We change all the typing rules to incorporate the structural rules:

**Example 2.** 
$$\frac{q \geq q' \quad \tau <: \tau'}{\Gamma, x : \tau \vdash_{q'}^q x : \tau'}$$

Algorithm for type inference:

1. Infer usual types (without annotations), which results in a type derivation (like example in figure 2 with all annotations removed);
2. Add potential variables where a potential annotation is required;
3. Derive from the typing rules linear constraints on potential variables;

**Example 3.** *For the fix example, some of the constraints are:*

$$\begin{array}{lllll}
r_0 \geq r'_0 & r_2 \leq q & p_1 \leq p & r_3 \geq r'_3 & p_2 \leq p_1 \\
r_1 = 0 & r'_2 \geq q' & p'_1 \geq p' & r_3 \leq r_2 & p'_2 \geq p_2 \\
r'_1 = 0 & & & & \\
r_4 \leq r'_3 + p_1 & r'_4 < r'_2 & & & \\
s_1 \geq s_2 + 2 & s'_1 = s'_2 & & & 
\end{array}$$

4. Solve constraints with LP solver;
5. Objective is the sum of initial potential annotations.

**Example 4.** *For the fix example the objective is to minimize  $p + q$ .*

### 3 Implementation in RAML and examples

Live RAML (Resource aware ML) demo showing binary counter, using the source code displayed in figure 3. Second example with queue.

$$\begin{array}{c}
\text{app} \frac{\text{relax} \frac{\text{app} \frac{id : \tau_{id}, ys : L^2(1) \vdash_0^0 id(us) : L^0(1)}{id : \tau_{id}, yss : L^2(1) \vdash_0^2 tick\{2\}(id(ys)) : L^0(1)}}{y : 1 \vdash_2^2 y : 1}}{id : \tau_{id}, y : 1, ys :: L^2(1) \vdash_0^2 cons(y, tick\{2\}id(ys)) : L^0(1)} \\
\frac{x : L^2(1) \vdash_0^0 z : L^2(1) \quad id : \tau_{id} \vdash_0^0 nil : L^0(1)}{id : \tau_{id}, x : L^2(1) \vdash e_{id} : L^0(1)} \\
\frac{id : \tau_{id} \vdash_0^0 \lambda(x)e_{id} : \tau_{id}}{\vdash_0^0 fix(id\lambda(x)e_{id}) : \tau_{id}}
\end{array}$$

Figure 1: Example of type inference

```

let rec id x =
  match x with
  | [] -> []
  | y::ys -> y::(let _ = Raml.tick 2.0 in ys)

type bit = Zero | One

let rec inc counter =
  match counter with
  | [] -> [One]
  | Zero::bs -> One::bs
  | One::bs -> Zero::(inc bs)

let rec in_many n =
  match n with
  | Z -> []
  | S n' -> inc (inc_many n')

```

Figure 2: Code for binary counter example