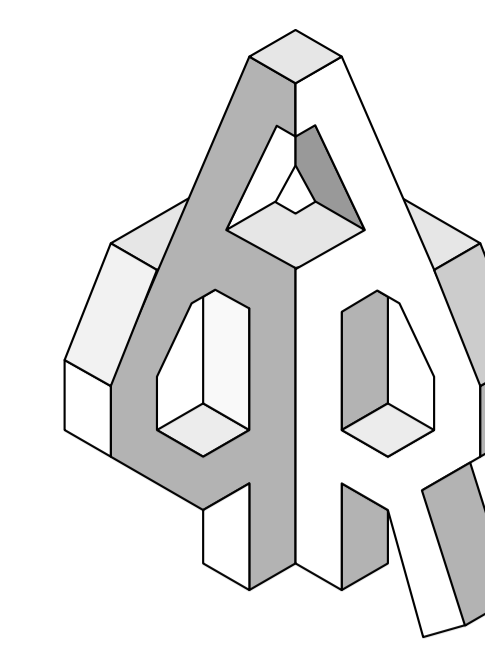


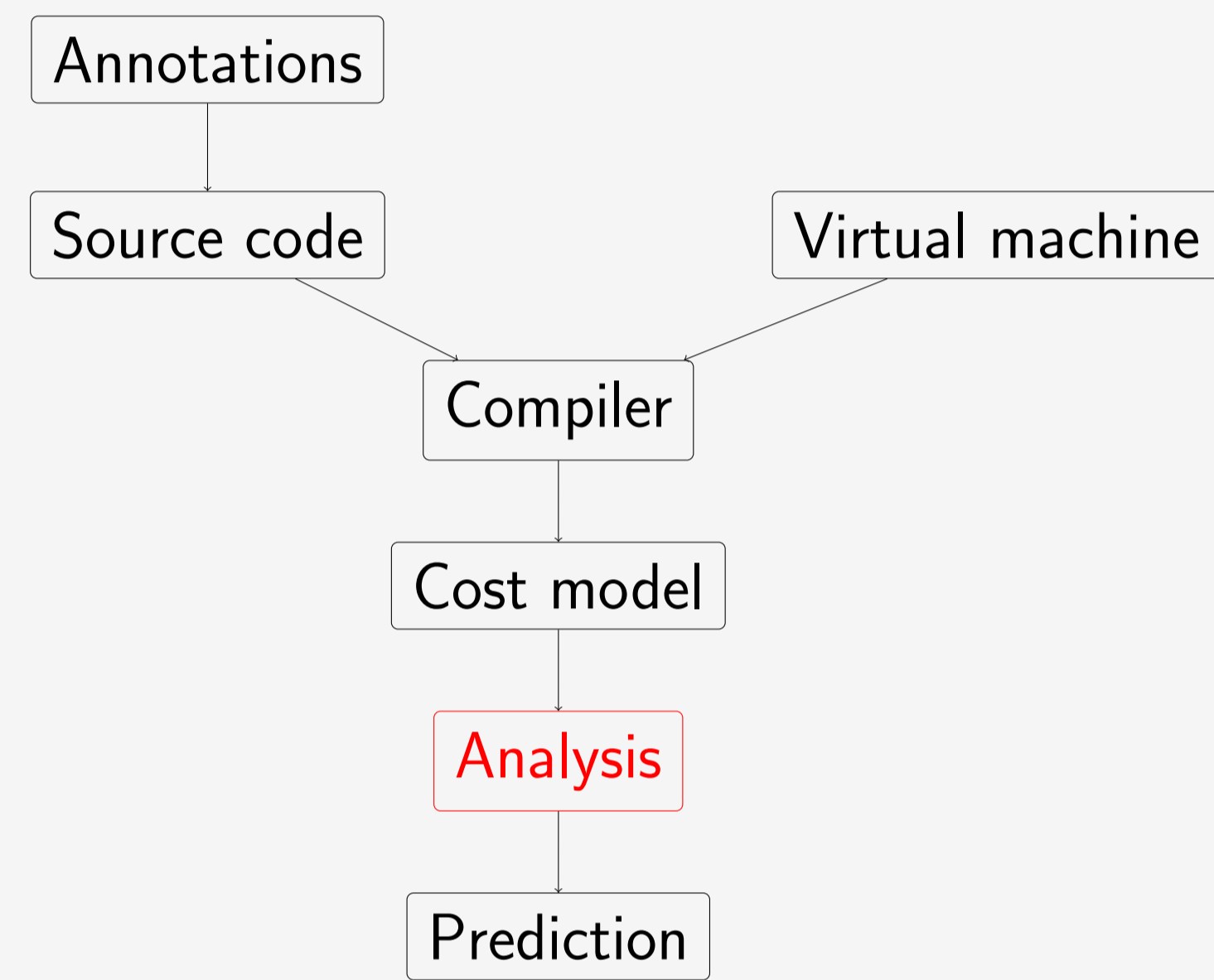
MEMORY CONSUMPTION ANALYSIS FOR APPLICATIVE LANGUAGES



Objectives

- ▶ Guarantee a safe upper bound of used memory.
- ▶ Consider how **garbage collection** affects this upper bound.
- ▶ Get a more precise upper bound than the existing methods.
- ▶ Consider the minimum amount of allocated memory to accomplish this.

Analysis of a Mini-ML



To create a cost model, we use

- ▶ Source code annotation.
- ▶ Data representation (data from the virtual machine).
- ▶ Compiler code transformation.

We target a Mini-ML composed of booleans, integers, data constructors and closures.

The whole process relies on two measures

- ▶ An **upper** bound on the amount of heap-allocated memory.
- ▶ A **lower** bound on the minimum of recycled memory.

The result of this analysis is the subtraction of these measures.

Targetting a virtual machine

The analysis is performed directly on **bytecode**.

- ▶ Explicit stack.
- ▶ Garbage Collector root set represented by this stack.
- ▶ Tail calls are considered.

We introduce the analysis on program source code (without considering compilation optimizations).

How do we proceed ?

- ▶ We use Abstract Interpretation techniques (boolean domain, integer domain (interval)).
- ▶ We apply the analysis to monotonic functions.
- ▶ We evaluate on both bounds of the interval (depending on function growth).

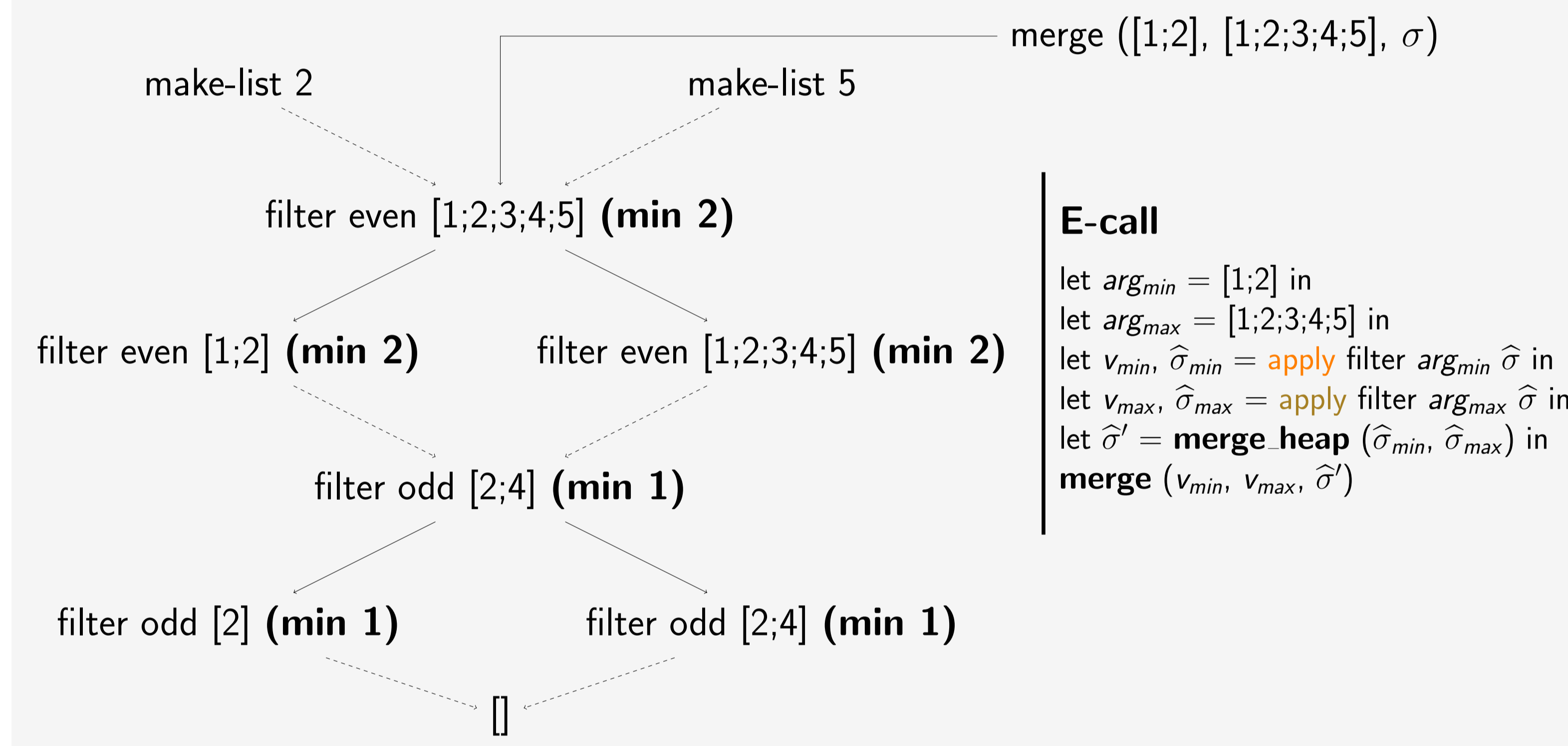
Analysis run on an example

Analysis of the following piece of code

```
let l = if Cond then make-list 2 else make-list 5 (* rule E-if *) in
  filter odd (filter even l) (* rule E-call *)
```

We suppose several things

- ▶ make-list n returns a list from 1 to n
- ▶ **min n** represents the relevant information to build back the minimal allocated structure.



E-call

```
let arg_min = [1;2] in
let arg_max = [1;2;3;4;5] in
let v_min, sigma_min = apply filter arg_min sigma in
let v_max, sigma_max = apply filter arg_max sigma in
let sigma' = merge_heap (sigma_min, sigma_max) in
merge (v_min, v_max, sigma')
```

Rules

merge call $(l, v, \hat{\sigma}) :=$

```
let cls = get (l, sigma) in
fold (fun acc_v cls ->
  let v, sigma' = fold (fun acc_v arg ->
    let arg_min = min arg in
    let arg_max = max arg in
    let v_min, sigma_min = apply cls arg_min sigma in
    let v_max, sigma_max = apply cls arg_max sigma in
    let sigma'' = merge_heap (sigma_min, sigma_max) in
    let v, sigma' = merge (v_min, v_max, sigma'') in
    merge (acc_v, v, sigma'))
```

$$\frac{l \notin \text{dom}(\hat{\sigma}) \quad \hat{\sigma}' = \hat{\sigma}[l \rightarrow (fun x \Rightarrow e)[\hat{\rho}]]}{\hat{\rho}, \hat{\sigma}' \vdash fun x \rightarrow e \rightsquigarrow l} \text{ (E-fun)}$$

$$\frac{\hat{\rho}, \hat{\sigma} \vdash e_0 \rightsquigarrow l, \hat{\sigma}' \quad \hat{\rho}, \hat{\sigma}' \vdash e_1 \rightsquigarrow v_s, \hat{\sigma}'' \quad v, \hat{\sigma}'' = \text{merge_heap}(l, v_s, \hat{\sigma}'')}{\hat{\rho}, \hat{\sigma} \vdash e_0 \ e_1 \rightsquigarrow v, \hat{\sigma}''} \text{ (E-call)}$$

$$\frac{\hat{\rho}, \hat{\sigma} \vdash e_{cd} \rightsquigarrow T_b, \hat{\sigma}' \quad \hat{\rho}, \hat{\sigma}' \vdash e_{cs} \rightsquigarrow v_{cs}, \hat{\sigma}_{cs} \quad \hat{\rho}, \hat{\sigma}' \vdash e_{alt} \rightsquigarrow v_{alt}, \hat{\sigma}_{alt}}{\hat{\rho}, \hat{\sigma}' \vdash if e_{cd} then e_{cs} else e_{alt} \rightsquigarrow \text{merge}(v_{cs}, v_{alt}, \text{merge_heap}(\hat{\sigma}_{cs}, \hat{\sigma}_{alt}))} \text{ (E-if)}$$

Concrete domains	Abstract domains
$z \in \text{Num} \equiv \mathbb{Z}$	$\hat{z} \in \widehat{\text{Num}} \equiv \{\perp_n\} \cup \{[a, b] \mid a \in \mathbb{Z}, b \in \mathbb{Z}\}$
$b \in \text{Bool} \equiv \{\text{False}, \text{True}\}$	$\hat{b} \in \widehat{\text{Bool}} \equiv \{\perp_b, \text{False}, \text{True}, \top_b\}$
$l \in \text{Loc} \equiv \mathbb{N}$	$\hat{l} \in \widehat{\text{Loc}} \equiv \mathbb{N} \cup \{\top_l\}$
$v_s \in V_s \equiv \text{Num} + \text{Bool} + \text{Loc}$	$\hat{v}_s \in \widehat{V}_s \equiv \widehat{\text{Num}} + \widehat{\text{Bool}} + \widehat{\text{Loc}}$
$\rho : \text{Name} \rightarrow V_s$	$\hat{\rho} : \text{Name} \rightarrow \widehat{V}_s$
$dc \in DC \equiv K \ \vec{v}_s \text{ with } v_s \in V_s$	$\hat{dc} \in \widehat{DC} \equiv \mathcal{P}(DC)$
$cls \in Cls \equiv \text{Code} \times \vec{v}_s \text{ with } v_s \in V_s$	$\hat{cls} \in \widehat{Cls} \equiv \mathcal{P}(Cls)$
$v_h \in V_H \equiv DC + Cls$	$\hat{v}_h \in \widehat{V}_H \equiv \widehat{DC} + \widehat{Cls}$
$\sigma : \text{Loc} \rightarrow V_H$	$\hat{\sigma} : \text{Loc} \rightarrow \widehat{V}_H$

Domain abbreviations

- ▶ $\text{Loc}, \widehat{\text{Loc}}$: Addresses
- ▶ DC, \widehat{DC} : Data Constructors
- ▶ Cls, \widehat{Cls} : Closures
- ▶ V_s, \widehat{V}_s : Immediate values
- ▶ V_H, \widehat{V}_H : Allocated values
- ▶ $\rho, \hat{\rho}$: Environment
- ▶ $\sigma, \hat{\sigma}$: Heap

Restrictions

- ▶ Analysed programs should be terminating.
- ▶ Monotonic functions.
- ▶ No side-effects.
- ▶ Only linear data structures are allowed.

Current issues

- ▶ Notion of **shapes** for nonlinear data structures.
- ▶ Adapt the same method to nonlinear data structures is difficult.
- ▶ Termination of the analysis.
- ▶ Liveness analysis required.
- ▶ References are part of a future work.

Related Works

The embounded project - Pedro Vasconcelos' work on sized types (target : Mini-ML)

- ▶ $Nil :: \forall i < \forall a. List^i a, i = 0 >$
- ▶ $Cons :: \forall ij < \forall a. (a, List^i a) \rightarrow List^j a, j = i + 1, i >= 0 >$
- ▶ $append :: (List^i a, List^j a) \rightarrow List^k a, k = i + j$

$$\frac{\Gamma_3 \vdash append(xs, l_2) : List^k a, k' = i' + j' \quad \Gamma_4 \vdash Cons(x, r) : List^k a, k = 1 + k'}{\Gamma_2 \vdash let r = append(xs, l_2) in Cons(x, r) : List^m a}$$

$$\frac{}{\Gamma_0 \vdash fun x with Nil \rightarrow l_2 | Cons(x, xs) \rightarrow let r = append(xs, l_2) in Cons(x, r) : List^n a}$$

RAML - Martin Hofmann's work on automatic amortized analysis (target : Mini-ML)

Hypothesis : $append :: (List(A, b_1), List(A, b_2), c) \rightarrow (List(A, b_3), d)$

$$\frac{\Gamma_1, n_1 \vdash l_2 : List(A, a_2), m_1 \quad \Gamma_2, n_2 \vdash append xs l_2 : List(A, a_4), m_2 \quad \Gamma_3, n_3 \vdash Cons(x, r), n_3 : List(A, a_5), m_3}{\Gamma_4, n_4 \vdash let r = append xs l_2 in Cons(x, r) : List(A, a_6), m_4}$$

$$\frac{}{\Gamma_0, n_0 \vdash fun l_1 with Nil \rightarrow l_2 | Cons(x, xs) \rightarrow let r = append xs l_2 in Cons(x, r) : List(A, a_7), m_0}$$

The analysis consists in finding the coefficient of the potential function which is a linear combination of the functions inputs.

References

- ▶ P. Hudak. A Semantic Model of Reference Counting and its Abstraction. In *Abstract Interpretation of Declarative Languages*, pages 45–62. Ellis Horwood, 1987.
- ▶ Steffen Jost. *Automated Amortised Analysis*. PhD thesis, Faculty of Mathematics, Computer Science and Statistics, LMU Munich, Germany, September 2010.
- ▶ Pedro Vasconcelos. *Space Cost Analysis Using Sized Types*. PhD thesis, School of Computer Science, University of St Andrews, Scotland, 2008.