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## Homework (DM)

### Compilation and Program Analysis (CAP)

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Type-directed compilation for a dynamic language  
*Refer to the semantic course of CAP (chapter 03) for the semantic of **WHILE***

Instructions:

1. Every single answer must be informally explained AND formally proved.
  2. Using LaTeX is NOT mandatory at all.
  3. Vous avez le droit de rédiger en Français.
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## Intro

In this homework, we consider a language called **PIE**, a dynamically typed Python-like programming language which contains operator such as `+` working on integers, arrays, booleans, ... For performance reasons, we want to compile **PIE** to **WHILE**, a statically typed C-like language. Our compilation procedure will therefore add dynamic type tests, manifested by `is_int` or `is_list` functions in the generated **WHILE** code. Such tests are generally costly. In a second step, we will define a typing analysis and a type-directed compilation step to avoid such tests when they are not needed.

We now define **PIE** formally. Syntax of the language is given in [Figure 2](#). Example of **PIE** programs are shown in [Figure 1](#). The language follows a python-like syntax with booleans, integers, and lists of integers. Statements includes assignments, if-then-else, and while loops. Finally, expressions can be constants, equality test or "addition". Additional works on any values of the same type:  $3 + 5 = 8$ ,  $[1] + [2,3] = [1,2,3]$ , and  $\text{true} + \text{false} = \text{true}$ . Additionally,

if-then-else expressions accept any value as test, and will test for “truthyness”. For instance, **Figure 1a** is a valid program, and returns 42. Finally, the last line in **Figure 1c** can be either an addition on integer, or a concatenation of lists, depending on the previous execution.

<pre> l:=3 if l:   r:=42 else:   r:=0 </pre>	<pre> if b:   x:=3   y:=4 else:   x:=[1]   y:=[2] z:=x+y </pre>
(a) A test on an integer	(c) A dynamically typed addition
<pre> if l:   x,l:=pop(l) else:   x:=0 </pre>	
(b) A piece of code using pop	

Figure 1: Examples of **PIE** programs

Expressions:	Statements:
$e \in \mathcal{E} ::= \text{true} \mid \text{false}$ $\mid n \mid []$ Constants $\mid [e]$ Singletons $\mid x$ Variable $\mid (e == e')$ Equality $\mid e + e$ Addition	$S \in \mathcal{Stm} ::= (x := e)$ Assign $\mid x, y := pop(e)$ Pop $\mid skip$ Do nothing $\mid S_1; S_2$ Sequence $\mid \text{if } e :$ $\quad S_1$ Test $\quad \text{else } :$ $\quad S_2$ $\mid \text{while } e :$ Loop $\quad S$

Figure 2: Grammar of the **PIE** language

The semantics of **PIE** is shown in **Figure 3**. The domain of values contains the traditional integers  $\mathbb{Z}$  and booleans  $\mathbb{B}$ , along with lists of integers  $\mathbb{L} = \mathbb{Z}^n$ . We note  $++$  the concatenation on lists.

We then define the evaluation of expressions, noted  $Val$ , taking an expression and a variable environment. The only peculiar behavior is the evaluation of  $e_1 + e_2$ , which uses the dynamically typed behavior highlighted before. We define truthyness as a function from values to booleans which analyze the value dynamically, and decide if it’s truthy or not. Finally, We define the evaluation of statement using a small step semantics. Again, the main peculiarity is the evaluation of the if-then-else statement, which uses truthyness.

**Value domain**

$$\begin{aligned}\mathbb{L} &= \mathbb{Z}^n \\ \mathbb{V} &= \mathbb{Z} \cup \mathbb{B} \cup \mathbb{L} \cup \{\perp\} \\ State &= Var \rightarrow \mathbb{Z} \cup \mathbb{B} \cup \mathbb{L}\end{aligned}$$

**Evaluation of Expressions**

$$\begin{aligned}(\text{List of } \mathbb{Z}) \quad Val : \mathcal{E} \times State \rightarrow \mathbb{V} \\ (\text{Values}) \quad Val(n, \sigma) = value(n) \\ Val(x, \sigma) = \sigma(x)\end{aligned}$$

**Truthiness**

$$\begin{aligned}is\_truthy : \mathbb{V} \rightarrow \mathbb{B} \cup \{\perp\} \\ is\_truthy(0) = false \\ is\_truthy(false) = false \\ is\_truthy([]) = false \\ is\_truthy(\perp) = \perp \\ is\_truthy(v) = true \quad \text{otherwise}\end{aligned}$$

$$Val(e_1 + e_2, \sigma) = \begin{cases} v_1 + v_2 & \text{if } v_1, v_2 \in \mathbb{Z} \\ v_1 \text{ or } v_2 & \text{if } v_1, v_2 \in \mathbb{B} \\ concat(v_1, v_2) & \text{if } v_1, v_2 \in \mathbb{L} \\ \perp & \text{otherwise} \end{cases}$$

where  $v_1 = Val(e_1, \sigma)$  and  $v_2 = Val(e_2, \sigma)$

**Evaluation of Statements**  $(Stm, State) \Rightarrow (Stm, State)$  or  $(Stm, State) \Rightarrow State$ 

$$\begin{aligned} \frac{Val(e, \sigma) \neq \perp}{(x := e, \sigma) \Rightarrow \sigma[x \mapsto Val(e, \sigma)]} \quad & \frac{Val(e, \sigma) = [v] + +L}{(x, y := pop(e), \sigma) \Rightarrow \sigma[x \mapsto v][y \mapsto L]} \quad & (skip, \sigma) \Rightarrow \sigma \\ \\ \frac{(S_1, \sigma) \Rightarrow \sigma'}{((S_1; S_2), \sigma) \Rightarrow (S_2, \sigma')} \quad & \frac{(S_1, \sigma) \Rightarrow (S'_1, \sigma')}{((S_1; S_2), \sigma) \Rightarrow (S'_1; S_2, \sigma')} \quad & \frac{is\_truthy(Val(b, \sigma)) = true}{(if \ b \ \text{then } S_1 \ \text{else } S_2, \sigma) \Rightarrow (S_1, \sigma)} \\ \\ & \frac{is\_truthy(Val(b, \sigma)) = false}{(if \ b \ \text{then } S_1 \ \text{else } S_2, \sigma) \Rightarrow (S_2, \sigma)} \\ \\ (while \ b \ \text{do } S \ \text{done}, \sigma) \Rightarrow (if \ b \ \text{then } (S; while \ b \ \text{do } S \ \text{done}) \ \text{else } skip, \sigma) \end{aligned}$$

Figure 3: Semantic of the **PIE** language

## 1 Semantics

**Question #1**

Explain the difference between big and small step semantics

**Question #2**

Give an example of program where the conditional in while is not a boolean.

Give an example of program where the conditional in while changes types across execution of the loop.

## 1.1 The WHILE language

We present below the syntax of **WHILE** as seen in the course. The syntax and rules are the same as present in the course, with some additions built-in operations for dynamic tests and lists.

The grammar is shown in **Figure 4**. Expressions have been extended with lists of integer including the empty list  $[]$ , the list with a single element  $[n]$ , and a concatenation operator. We also have operators `is_int`, `is_bool` and `is_list` to check the type of an expression.

The semantics is shown in **Figure 5** and follows the one given in the course. No operator is available for mixed types: addition only works with two integers, concatenation `++` with two lists and equality `==` for any two expressions of the same type.

Expressions:

Statements:

$e \in \mathcal{E}_w ::= \text{true} \mid \text{false} \mid n \mid []$	Constants $S \in \text{Stm}_w ::= (x := e)$	Assign
$  [e]$	Singletons $  x, y := \text{pop}(e)$	Pop
$  x$	Variable $  \text{skip}$	Do nothing
$  (b \parallel b) \mid (b \&\& b)$	Bool Op $  S_1; S_2$	Sequence
$  (e == e')$	Equality $  \text{if } e \text{ then } S_1 \text{ else } S_2$	Test
$  e + e$	Addition $  \text{while } e \text{ do } S \text{ done}$	Loop
$  \text{concat}(e, e')$	List concat $  \text{Fail}$	Fail
$  \text{is\_int} \mid \text{is\_bool} \mid \text{is\_list}$	Type checks	

Figure 4: Grammar of the **WHILE** language

**Evaluation of Expressions:**  $\text{Val} : \mathcal{E} \times \text{State} \rightarrow \mathbb{Z} \cup \mathbb{B} \cup \mathbb{L}$

$\text{Val}(n, \sigma) = \text{value}(n)$	$\text{Val}(\text{is\_int}(e), \sigma) = \text{true}$	if $\text{Val}(e, \sigma) \in \mathbb{Z}$
$\text{Val}(x, \sigma) = \sigma(x)$	$\text{Val}(\text{is\_int}(e), \sigma) = \text{false}$	otherwise
$\text{Val}(e_1 + e_2, \sigma) = \text{Val}(e_1, \sigma) + \text{Val}(e_2, \sigma)$	$\text{Val}(\text{is\_list}(e), \sigma) = \text{true}$	if $\text{Val}(e, \sigma) \in \mathbb{L}$
$\text{Val}(\text{concat}(e_1, e_2), \sigma) = \text{Val}(e_1, \sigma) ++ \text{Val}(e_2, \sigma)$	$\text{Val}(\text{is\_list}(e), \sigma) = \text{false}$	otherwise
...	...	

**Evaluation of Statements**  $(\text{Stm}, \text{State}) \Rightarrow (\text{Stm}, \text{State}) \mid \text{State} \mid \text{Error}$

$(x := e, \sigma) \Rightarrow \sigma[x \mapsto \text{Val}(e, \sigma)]$	$(\text{skip}, \sigma) \Rightarrow \sigma$	$(\text{Fail}, \sigma) \Rightarrow \text{Error}$
$\frac{\text{Val}(e, \sigma) = [v] ++ L}{(x, y := \text{pop}(e), \sigma) \Rightarrow \sigma[x \mapsto v][y \mapsto L]}$	$\frac{(S_1, \sigma) \Rightarrow \sigma'}{((S_1; S_2), \sigma) \Rightarrow (S_2, \sigma')}$	$\frac{(S_1, \sigma) \Rightarrow (S'_1, \sigma')}{((S_1; S_2), \sigma) \Rightarrow (S'_1; S_2, \sigma')}$
$\frac{(S_1, \sigma) \Rightarrow \text{Error}}{((S_1; S_2), \sigma) \Rightarrow \text{Error}}$	$\frac{\text{Val}(b, \sigma) = \text{true}}{(\text{if } b \text{ then } S_1 \text{ else } S_2, \sigma) \Rightarrow (S_1, \sigma)}$	
	$\frac{\text{Val}(b, \sigma) = \text{false}}{(\text{if } b \text{ then } S_1 \text{ else } S_2, \sigma) \Rightarrow (S_2, \sigma)}$	
$(\text{while } b \text{ do } S \text{ done}, \sigma) \Rightarrow (\text{if } b \text{ then } (S; \text{while } b \text{ do } S \text{ done}) \text{ else skip}, \sigma)$		

Figure 5: Semantic of the **WHILE** language

**Question #3**

Write a program that does the same computation as the last one you provided in Question #2, where the conditional in `while` changes types across execution of the loop. Note that `while` in **WHILE** only accepts boolean conditions. You can introduce additional variables.

## 2 Naive Compilation

We now compile **PIE** to the **WHILE** language. We recall that our **WHILE** language possess three extra functions: `is_bool`, `is_int` and `is_list`. Given  $p$  a **PIE** program, we note  $\llbracket p \rrbracket$  the corresponding **WHILE** program.

### 2.1 Compilation of expressions

We first look at expressions. Given an **PIE** expression  $e$ ,  $\llbracket e \rrbracket$  returns a pair composed of a **WHILE** statement  $S_w$  and a variable  $x_w$ , such that  $x_w$  is defined after the execution of  $S_w$ , and contains the returned value computed by  $e$ .

$$\begin{array}{c}
 \overline{\llbracket x \rrbracket = \text{skip}, x} \qquad \overline{x \text{ fresh} \quad \llbracket n \rrbracket = (x := n), x} \qquad \overline{\llbracket e \rrbracket = S, x \quad x_L \text{ fresh} \quad \llbracket [e] \rrbracket = (S; x_L := [x]), x_L} \\
 \\
 \overline{\llbracket e_1 \rrbracket = S_1, x_1 \quad \llbracket e_2 \rrbracket = S_2, x_2 \quad x_b \text{ fresh} \quad \llbracket e_1 == e_2 \rrbracket = (S_1; S_2; x_b := (x_1 == x_2)), x_b} \qquad \overline{\text{TO COMPLETE} \quad x_f \text{ fresh} \quad \llbracket e + e' \rrbracket = \text{TO COMPLETE}, x_f}
 \end{array}$$

**Question #4**

Complete the compilation of expressions by defining the compilation of `+`.

## 2.2 Compilation of statements

We now define the compilation of statements. Given a **PIE** statement  $S$ ,  $\llbracket S \rrbracket$  returns a **WHILE** statement  $S_w$ . We use an auxiliary function  $Truthy(x)$  which outputs a statement  $S_w$  and a variable  $x_w$  which indicates if  $x$  is truthy.

$$\begin{array}{c}
 \text{Truthy}(x) = \frac{x_w \text{ fresh}}{\text{if } (\text{is\_bool}(x)) \{x_w := x\} \\
 \text{else if } (\text{is\_int}(x) \ \&\& \ x == 0) \{x_w := \text{false}\} \\
 \text{else if } (\text{is\_list}(x) \ \&\& \ x == []) \{x_w := \text{false}\}, x_w \\
 \text{else } \{x_w := \text{true}\}}
 \end{array}$$

$$\begin{array}{c}
 \frac{}{\llbracket \text{skip} \rrbracket = \text{skip}} \qquad \frac{\llbracket e \rrbracket = S_w, x_w}{\llbracket x := e \rrbracket = S_w; x := x_w}
 \end{array}$$

$$\frac{\llbracket e \rrbracket = S_w, x_w \quad S_{test}, x_{test} = Truthy(x_w) \quad \llbracket S_0 \rrbracket = S_{w,0} \quad \llbracket S_1 \rrbracket = S_{w,1}}{\left[ \begin{array}{l} \text{if } e : \\ S_0 \\ \text{else :} \\ S_1 \end{array} \right] = \begin{array}{l} S_w; \\ = S_{test}; \\ \text{if } x_{test} \text{ then } S_{w,0} \text{ else } S_{w,1} \end{array}}$$

$$\frac{\text{TO COMPLETE}}{\llbracket x, l := pop(e) \rrbracket = \text{TO COMPLETE}} \qquad \frac{\text{TO COMPLETE}}{\left[ \begin{array}{l} \text{while } e : \\ S \end{array} \right] = \text{TO COMPLETE}}$$

### Question #5

Define the compilation of  $pop$ .

### Question #6

Compile the code of **Figure 1b**.

### Question #7 (Difficult)

Define the compilation of **while**. You can use  $Truthy$ .

We now want to prove the correction of the compilation step.

### Question #8 (Difficult)

Prove the correctness of expression compilation. Formally you should prove the following statement:

$$\left\{ \begin{array}{l} \llbracket e \rrbracket = S_w, x_w \\ \sigma \subseteq \sigma_w \\ Val(\sigma, e) = v \neq \perp \end{array} \right. \implies \exists \sigma'_w. \left\{ \begin{array}{l} \sigma \subseteq \sigma'_w \\ (S_w, \sigma_w) \Rightarrow^* \sigma'_w \\ Val(\sigma'_w, x_w) = v \end{array} \right.$$

The proof is an induction, you will only consider the following cases: integer constant  $n$ , singleton  $[e]$ , and  $+$  operator  $(e + e')$ .

**Question #9 (Difficult)**

Prove the correctness of statement compilation. Namely prove the two following assertions:

$$\begin{cases} \llbracket S \rrbracket = S_W \\ \sigma \subseteq \sigma_W \\ (S, \sigma) \Rightarrow (S', \sigma') \end{cases} \implies \exists S'_W, \sigma'_W. \begin{cases} (S_W, \sigma_W) \Rightarrow^* (S'_W, \sigma'_W) \\ \llbracket S' \rrbracket = S'_W \\ \sigma' \subseteq \sigma'_W \end{cases}$$

and

$$\begin{cases} \llbracket S \rrbracket = S_W \\ \sigma \subseteq \sigma_W \\ (S, \sigma) \Rightarrow \sigma' \end{cases} \implies \exists \sigma'_W. \begin{cases} (S_W, \sigma_W) \Rightarrow^* \sigma'_W \\ \sigma' \subseteq \sigma'_W \end{cases}$$

The proof is an induction, you will only consider the following cases: if statement and assignment.

**Question #10**

We now try to investigate when the compilation of an expression can lead to an error. Write the property that states that a compiled expression only fails if it is the compilation of an invalid **PIE** expression. In other words, given  $e$  a **PIE** expression, let  $\llbracket e \rrbracket = e_W, S_W$ , under which condition on  $Val(\sigma, e)$  do we have  $(S_W, \sigma_W) \Rightarrow^* Error$ . Is the condition necessary and sufficient?

Note: you do not need to prove the property

**Question #11**

Informally state in one or two sentences a similar property on statements.

### 3 Optimizing compilation

The code we emit so far is very naive: For instance, if we add two integers, we will always check their type before doing the addition. Similarly, if the condition of an `if` is always a boolean, we will still consider the list and integer cases.

We want to improve this by statically detecting if the types of operand are known, and remove redundant cases if possible. For this purpose, we first develop a type analysis that evaluate which type can appear at a specific point in the program. We then use this type information to emit optimized code through additional compilation rules.

#### 3.1 Typing Analysis

We now define a typing analysis that tries to associate a set of potential types to each expression, and infers a typing environment that maps each variable to such set of types. We consider **B**, **Z** and **L** the type of booleans, integers and lists. We note the domain of types  $\mathcal{T} = \mathbf{B} \mid \mathbf{Z} \mid \mathbf{L}$  and our typing environment  $\Gamma = \text{Var} \rightarrow \mathcal{P}(\mathcal{T})$  from variables to sets of types.

We now define our analysis judgement on expressions, denoted  $\Gamma \vdash \mathcal{E} : \mathcal{P}(\mathcal{T})$ , which returns a set of types and on statements, denoted  $\Gamma \vdash \text{Stm} : \Gamma$  which returns an environment. We rely on a set comparison operator:  $\Gamma \subseteq \Gamma'$  is true if for each  $x$ , we have  $\Gamma(x) \subseteq \Gamma'(x)$ .

$$\begin{array}{c}
 \overline{\Gamma \vdash x : \Gamma(x)} \quad \overline{\Gamma \vdash n : \{\mathbf{Z}\}} \quad \overline{\Gamma \vdash \text{true/false} : \{\mathbf{B}\}} \quad \overline{\Gamma \vdash [e] : \{\mathbf{L}\}} \\
 \\
 \frac{\Gamma \vdash e_1 : T_1 \quad \Gamma \vdash e_2 : T_2}{\Gamma \vdash e_1 + e_2 : T_1 \cup T_2} \quad \frac{\Gamma \vdash e : T}{\Gamma \vdash x := e : \Gamma[x \mapsto T]} \quad \frac{\Gamma \vdash S_1 : \Gamma' \quad \Gamma' \vdash S_2 : \Gamma''}{\Gamma \vdash S_1; S_2 : \Gamma''} \\
 \\
 \frac{\Gamma \subseteq \Gamma_f \quad \Gamma_f \vdash S : \Gamma' \quad \Gamma' \subseteq \Gamma_f}{\Gamma \vdash \left( \begin{array}{c} \text{while } e : \\ S \end{array} \right) : \Gamma_f}
 \end{array}$$

#### Question #12

Let  $\Gamma = [x \mapsto \{\mathbf{Z}\}]$  Type the following expressions in  $\Gamma$ :  $x + 1$ ,  $[\text{true}]$ ,  $x + [3]$ .

#### Question #13

Define the typing analysis for *pop*.

#### Question #14

In [Figure 1c](#), what should be the type for  $z$  on the last line.

#### Question #15



Define the typing analysis for *if*. You may use a  $\cup$  operator such that:

$$(\Gamma \cup \Gamma')(x) = \Gamma(x) \cup \Gamma'(x)$$

### Question #16

Explain the rule for while.

### Question #17 (Difficult)

Prove that the analysis always succeeds for expressions: for all  $e$  and  $\Gamma$  such that  $\text{Vars}(e) \subset \text{Dom}(\Gamma)$ , there exists a  $T$  such that  $\Gamma \vdash e : T$ . Proof is by induction, only consider the case for  $+$  and  $[e]$ .

## 3.2 Type-directed Compilation

We now have a more precise account of which types are admissible at each point in the program, thanks to the typing analysis developed in the previous section. For simplicity, we consider a function  $\text{Type} : \mathcal{E} \rightarrow \mathcal{P}(\mathcal{T})$  that gives us the set of types inferred by the typing analysis for any expression of the program (see usage below).

### Question #18

Consider [Figure 1b](#). Consider that  $l$  is always a list, i.e.  $\text{Type}(l) = \{\mathbf{L}\}$ . Give an optimized version of the compilation of this program that uses the information provided by the typing analysis.

We specify the optimised compilation as an additional set of compilation rule that are redundant with the existing ones but specialised to optimisable cases. The idea is that we first try to apply optimised rules and fallback to the non-optimised compilation if no optimised rule applies. For example we add the following rule for *if*, when the condition is always a boolean:

$$\frac{\text{Type}(e) = \{\mathbf{B}\} \quad \llbracket e \rrbracket = e_w, S_w \quad \llbracket S_0 \rrbracket = S_{w,0} \quad \llbracket S_1 \rrbracket = S_{w,1}}{\left[ \begin{array}{l} \text{if } e : \\ \quad S_0 \\ \text{else} : \\ \quad S_1 \end{array} \right] = S_w; \text{if } e_w \text{ then } S_{w,0} \text{ else } S_{w,1}}$$

### Question #19

Complete the following rule for *if*:

$$\frac{\text{Type}(e) = \{\mathbf{L}\} \quad \text{TO COMPLETE}}{\left[ \begin{array}{l} \text{if } e : \\ \quad S_0 \\ \text{else} : \\ \quad S_1 \end{array} \right] = \text{TO COMPLETE}}$$

**Question #20**

Complete the following rule for +:

$$\frac{Type(e) = \{\mathbf{Z}, \mathbf{L}\} \quad Type(e') = \{\mathbf{Z}, \mathbf{L}\} \quad \text{TO COMPLETE}}{\llbracket e + e' \rrbracket = \text{TO COMPLETE}}$$

Explain informally in two sentences how this rule would optimise the compilation of **Figure 1c**.

**Question #21 (Difficult)**

**Bonus question.** How would you define a type-based optimised compilation for while?