

Coeffects: type systems for resource analysis

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Outline

- 1 Introduction
- 2 A simple example
- 3 Current work
- 4 Future work/collaborations

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Motivation/aim from the project's description

T3.3: Substructural types for entities

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T3.3: Substructural types for entities

Applications based on complex dynamic systems as IoT applications have to verify **resource sensitive** properties since often entities have limited interaction and synchronization capabilities, computational power and storage space.

Type systems should support the analysis of several kinds of **resource sensitive** as information flow, program sensitivity, . . .

We will investigate the use of various forms of **substructural types** to express such properties, i.e., type abstraction mechanisms able to control the number of uses of a data or structure operation.

Motivation/aim in summary

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- modern applications are **resource-aware**
- important to **keep track of the use** of resources
- in programs, resources are modeled as **variables**
- **substructural** type systems keep track of the use of variables

Standard type systems

Typing judgment

$$x_1 : T_1, \dots, x_n : T_n \vdash e : T$$

- e expression
- T type
- $\Gamma = x_1 : T_1, \dots, x_n : T_n$ type context

Weakening and contraction are allowed

$$\begin{array}{c}
 \text{(WEAK)} \quad \frac{\Gamma \vdash e : T_2}{\Gamma, x : T_1 \vdash e : T_2} \qquad \text{(CONTR)} \quad \frac{\Gamma, x : T_1, x : T_1 \vdash e : T_2}{\Gamma, x : T_1 \vdash e : T_2}
 \end{array}$$

Coeffect systems

- a flexible form of substructural type systems
- recently introduced [PetricekOM@ICFP14,BrunelGMZ@ESOP14]
- contexts are enriched with **coeffects** tracking the use of variables

Coeffect systems

Coeffect judgment

$$x_1 :_{c_1} T_1, \dots, x_n :_{c_n} T_n \vdash e : T$$

- e expression
- T type
- $\Gamma = x_1 :_{c_1} T_1, \dots, x_n :_{c_n} T_n$ type **and coeffect** context

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- $\Gamma = x_1 :_{c_1} T_1, \dots, x_n :_{c_n} T_n$ type **and coeffect** context
- c_i models how variable x_i is used in e

- 1 Introduction
- 2 A simple example**
- 3 Current work
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Simply-typed lambda-calculus with pairs and integers

$$t ::= n \mid \langle t_1, t_2 \rangle \mid x \mid \lambda x:T.t \mid t_1 t_2$$

$$n ::= 0 \mid 1 \mid -1 \mid 2 \mid -2 \mid \dots$$

$$T ::= \text{int} \mid T_1 \times T_2 \mid T_1 \rightarrow T_2$$

Rules of the standard type system

$$(T\text{-CONST}) \frac{}{\Gamma \vdash n : \text{int}} \quad (T\text{-PAIR}) \frac{\Gamma \vdash t_1 : T_1 \quad \Gamma \vdash t_2 : T_2}{\Gamma \vdash \langle t_1, t_2 \rangle : T_1 \times T_2}$$

$$(T\text{-VAR}) \frac{}{\Gamma, x : T \vdash x : T} \quad (T\text{-ABS}) \frac{\Gamma, x : T_1 \vdash t : T_2}{\Gamma \vdash \lambda x : T_1. t : T_1 \rightarrow T_2}$$

$$(T\text{-APP}) \frac{\Gamma \vdash t_1 : T_2 \rightarrow T_1 \quad \Gamma \vdash t_2 : T_2}{\Gamma \vdash t_1 t_2 : T_1}$$

Types do not track the use of variables

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- $\emptyset \vdash duplicate : int \rightarrow int \times int$

Adding coeffects

- 0 assigned to unused variables

Adding coeffects

- **0** assigned to unused variables
- **1** assigned to variables used linearly (exactly once)

Adding coeffects

- 0 assigned to unused variables
- 1 assigned to variables used linearly (exactly once)
- ω assigned to variables used more than once

Lambda calculus with coeffacts: enriching function types

$$t ::= n \mid \langle t_1, t_2 \rangle \mid x \mid \lambda x:T.t \mid t_1 t_2$$

$$n ::= 0 \mid 1 \mid -1 \mid 2 \mid -2 \mid \dots$$

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Lambda calculus with coeffects: typing rules

$${}_{(\text{T-PAIR})} \frac{\Gamma_1 \vdash t_1 : T_1 \quad \Gamma_2 \vdash t_2 : T_2}{\Gamma_1 \oplus \Gamma_2 \vdash \langle t_1, t_2 \rangle : T_1 \times T_2}$$

$\Gamma_1 \oplus \Gamma_2$ context obtained by pointwise sum of coeffects

\oplus	0	1	ω
0	0	1	ω
1	1	ω	ω
ω	ω	ω	ω

Lambda calculus with coeffacts: typing rules

$$(T\text{-VAR}) \frac{}{\mathbf{0} \otimes \Gamma, x : \mathbf{1} \quad T \vdash x : T}$$

$\mathbf{c} \otimes \Gamma$ context obtained by pointwise product of coeffacts

in $\mathbf{0} \otimes \Gamma$ all variables have coeffact $\mathbf{0}$

\otimes	$\mathbf{0}$	$\mathbf{1}$	ω
$\mathbf{0}$	$\mathbf{0}$	$\mathbf{0}$	$\mathbf{0}$
$\mathbf{1}$	$\mathbf{0}$	$\mathbf{1}$	ω
ω	$\mathbf{0}$	ω	ω

Lambda calculus with coeffacts: typing rules

$$(T\text{-ABS}) \frac{\Gamma, x : {}_c T_1 \vdash t : T_2}{\Gamma \vdash \lambda x : T_1. t : T_1 \xrightarrow{{}_c} T_2}$$

annotation c = coeffact of x in the body t

Lambda calculus with coeffacts: typing rules

$$(\text{T-APP}) \frac{\Gamma_1 \vdash t_1 : T_2 \xrightarrow{c} T_1 \quad \Gamma_2 \vdash t_2 : T_2}{\Gamma_1 \oplus (c \otimes \Gamma_2) \vdash t_1 t_2 : T_1}$$

- sum of the coeffacts of t_1 and
- the coeffacts of the argument t_2 multiplied by the coeffacts of the function

Typing judgments with coeffects

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- $\emptyset \vdash duplicate : \text{int} \xrightarrow{\omega} \text{int} \times \text{int}$

Type derivation (1): function

$$\emptyset \vdash \lambda x:\text{int}.\langle x, x \rangle : \text{int} \xrightarrow{\omega} \text{int} \times \text{int}$$

Type derivation (1): function

$$(T\text{-ABS}) \frac{x : {}^\omega \text{int} \vdash \langle x, x \rangle : \text{int} \times \text{int}}{\emptyset \vdash \lambda x:\text{int}.\langle x, x \rangle : \text{int} \xrightarrow{\omega} \text{int} \times \text{int}}$$

Type derivation (1): function

$$\begin{array}{c}
 \text{(T-PAIR)} \frac{x : \mathbf{1} \text{ int} \vdash x : \text{int} \quad x : \mathbf{1} \text{ int} \vdash x : \text{int}}{x : \omega \text{ int} \vdash \langle x, x \rangle : \text{int} \times \text{int}} \\
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Type derivation (1): function

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 \end{array}$$

in the consequence of rule (T-PAIR) x has coefficient ω since $\mathbf{1} \oplus \mathbf{1} = \omega$

Type derivation (2): application

$$y : \omega \text{ int} \vdash \lambda x:\text{int}.\langle x, x \rangle \quad y : \text{int} \times \text{int}$$

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$$\text{(T-APP)} \frac{\emptyset \vdash \lambda x:\text{int}. \langle x, x \rangle : \text{int} \xrightarrow{\omega} \text{int} \times \text{int} \quad y : \mathbf{1} \text{ int} \vdash y : \text{int}}{y : \omega \text{ int} \vdash \lambda x:\text{int}. \langle x, x \rangle y : \text{int} \times \text{int}}$$

Type derivation (2): application

$$\begin{array}{c}
 \dots \\
 \text{(T-APP)} \frac{\frac{\emptyset \vdash \lambda x:\text{int}. \langle x, x \rangle : \text{int} \xrightarrow{\omega} \text{int} \times \text{int}}{\quad} \quad \text{(T-VAR)} \frac{}{y : \mathbf{1} \text{ int} \vdash y : \text{int}}}{y : \omega \text{ int} \vdash \lambda x:\text{int}. \langle x, x \rangle y : \text{int} \times \text{int}}
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in the consequence of rule (T-APP) y has coefficient ω since $\omega \otimes \mathbf{1} = \omega$

Other examples: counting occurrences

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- coeffacts = natural numbers
- sum and product = sum and product in \mathbb{N}
- rules remain the same, only coeffacts and their operations change

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- $\emptyset \vdash duplicate : \text{int} \xrightarrow{2} \text{int} \times \text{int}$

Other examples

- **confidentiality**: check that a variable declared as private will not become public during the execution [GaborardiKOBUE@ICFP16]

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- **noise sensitivity**: outputs of function with type $A \xrightarrow{r} B$ evaluated on input x and input $x + d$ differ at most $r * d$ [PierceR@ICFP10,AbelB@ICFP20]

Other examples

- **confidentiality**: check that a variable declared as private will not become public during the execution [GaborardiKOB@ICFP16]
- **noise sensitivity**: outputs of function with type $A \xrightarrow{r} B$ evaluated on input x and input $x + d$ differ at most $r * d$ [PierceR@ICFP10, AbelB@ICFP20]
- **Granule**: fully-fledged Haskell-like language in which various kinds of coeffects (counting occurrences, confidentiality, ...) are supported [OrchardLE@ICFP19]

Structure

- examples show the same pattern

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- we can keep the rules and change only the coefficients

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- we can keep the rules and change only the coefficients
- general structure of coefficients = **semiring** = $(\mathcal{C}, \oplus, \mathbf{0}, \otimes, \mathbf{1})$ such that
 - $(\mathcal{C}, \oplus, \mathbf{0})$ is a commutative monoid
 - $(\mathcal{C}, \otimes, \mathbf{1})$ is a monoid
 - given c_1, c_2, c_3 in \mathcal{C}
 - $c_1 \otimes (c_2 \oplus c_3) = (c_1 \otimes c_2) \oplus (c_1 \otimes c_3)$
 - $(c_1 \oplus c_2) \otimes c_3 = (c_1 \otimes c_3) \oplus (c_2 \otimes c_3)$
 - given c in \mathcal{C}
 - $\mathbf{0} \otimes c = c \otimes \mathbf{0} = \mathbf{0}$

- 1 Introduction
- 2 A simple example
- 3 Current work**
- 4 Future work/collaborations

Current work: coeffects for Java-like languages

Investigate the use of coeffects to express different properties of interest in Java-like languages

- 1 **Sharing coeffects** for an imperative Java-like calculus
[BianchiniDGZ@submitted]
- 2 Java-like calculus with **user-defined** coeffects
[BianchiniDGZ@ICTCS22]

Sharing coeffects

- coeffects modeling **sharing** possibly introduced by an imperative program
- key issue for correctness in presence of mutable state, even more with concurrency

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- coeffects modeling **sharing** possibly introduced by an imperative program
- key issue for correctness in presence of mutable state, even more with concurrency
- huge literature on sharing and mutation control, **never modeled by coeffects**
- example of property of interest:
the result of an expression will be the **unique entry point** for a portion of store
hence, can be safely handled by a thread

Sharing coeffects

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Sharing coeffects

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- $X \cap Y \neq \emptyset$ means: sharing could be introduced between x and y

Sharing coeffects

- assume a countable set of **links** ℓ with a distinguished element **res**
- coeffects $X, Y, \dots =$ sets of links
- in a judgment $\Gamma, x : X \ T_1, y : Y \ T_2 \vdash e : T_3$
- $X \cap Y \neq \emptyset$ means: sharing could be introduced between x and y
- $\text{res} \in X$ means: sharing could be introduced between x and the final result

An example

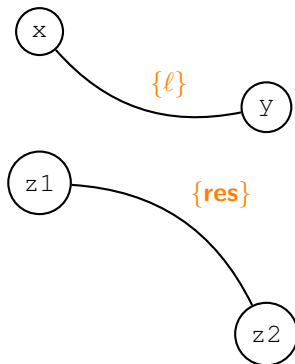
```
class B {int f;}
class C {B f1; B f2;}
```

```
x.f1=y; new C(z1, z2)
```

```
x : $\{e\}$  C, y : $\{e\}$  B, z1 : $\{res\}$  B, z2 : $\{res\}$  B  $\vdash$  x.f1=y; new C(z1, z2) : C
```

An example

$x : \{l\} C, y : \{l\} B, z1 : \{res\} B, z2 : \{res\} B \vdash x.f=y; \text{new } C(z1, z2) : C$



User-defined coeffects

- Java-like calculus where declared variables can be annotated by coeffects
- Coeffect annotations are written in the language itself
- They are expressions of (subclasses of) a predefined class `Coeffect`
- Analogous to Java exceptions which are expressions of (subclasses of) `Exception`

The Coeffect class

general structure of coeffects = **semiring** = $(\mathcal{C}, \oplus, \mathbf{0}, \otimes, \mathbf{1})$

```
class Coeffect {
  Coeffect sum(Coeffect c) { new Coeffect() }
  Coeffect mult(Coeffect c) { new Coeffect() }
  Coeffect zero() { new Coeffect() }
  Coeffect one() { new Coeffect() }
}
```

Example of user-defined coeffects: 0, 1, ω

```
class Linearity extends Coeffect{  
  Coeffect zero(){ new Zero()}  
  Coeffect one(){new One()}  
}
```

0 coeffects

```
class Zero extends Linearity{
  Coeffect sum(Coeffect c) {
    case c of
      (Linearity x) x
      (Coeffect x) new Coeffect()
  }
  Coeffect mult(Coeffect c) {
    case c of
      (Linearity x) new Zero()
      (Coeffect x) new Coeffect()
  }
}
```

1 coeffects

```

class One extends Linearity{
  Coeffect sum(Coeffect c) {
    case c of
      (Zero x) new One()
      (One x) new Omega()
      (Omega x) new Omega()
      (Coeffect x) new Coeffect() }
  Coeffect mult(Coeffect c) {
    case c of
      (Linearity x) x
      (Coeffect x) new Coeffect()
  }
}

```


ω coeffects

```
class Omega extends Linearity{
  Coeffect sum(Coeffect c) {
    case c of
      (Linearity x) new Omega()
      (Coeffect x) new Coeffect()
  }
  Coeffect mult(Coeffect c) {
    case c of
      (Zero x) new Zero()
      (One x) new Omega()
      (Omega x) new Omega()
      (Coeffect x) new Coeffect()
  }
}
```

Example

```

class Pair {
  A fst; A snd;
}

class A {
  Pair discard [new Zero()] () {
    return new Pair{new A(), new A()}
  }

  Pair linear [new One()] () {
    return new Pair{this, new A()}
  }

  Pair duplicate [new Omega()] () {
    return new Pair(this, this)
  }
}

```

- 1 Introduction
- 2 A simple example
- 3 Current work
- 4 Future work/collaborations**

Future work

- From coeffects to **graded modal types**
 - with coeffect annotations it is possible to specify how **a variable** should be used, but not to do the same for **the result of an expression**
 - **graded modal types**, which are, roughly, types annotated with coeffects (grades), would allow to overcome this limitation

Future work

- From coeffects to **graded modal types**
 - with coeffect annotations it is possible to specify how **a variable** should be used, but not to do the same for **the result of an expression**
 - **graded modal types**, which are, roughly, types annotated with coeffects (grades), would allow to overcome this limitation
- **Integration** of different coeffect systems
 - different coeffect systems coexist in Granule and our Java-like calculus
 - we plan to provide a general foundation

Hints for collaborations

- Other tasks/applications where coeffects could be fruitfully employed
- Implementation:
 - rules in coeffect systems directly lead to an algorithm (coeffects are **computed** bottom up)
 - user-defined coeffects in Java could be implemented as an **extension to be translated in plain Java**

Thank You

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