

Implicit Computational Complexity

Guest Lecture for the course *Algorithms and Complexity*

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1 Preliminaries

2 Primitive recursive functions

3 Bounded recursion on notation

4 Safe recursion on notation

Warm up

- ▶ **Question:** What is computational complexity?

Implicit Computational Complexity

- ▶ **Answer to previous question:** computational complexity studies *complexity classes*, i.e. classes of languages (resp. functions) that can be accepted (resp. computed) by a **machine** (e.g. Turing machine) in a certain **resource bound** (e.g. time and space)
- ▶ *Implicit computational complexity (ICC)*: branch of computational complexity describing complexity classes **without** explicit reference to **machine models** or **cost bounds**.
- ▶ ICC originates in the 90's with seminal paper on *safe recursion* [Bellantoni and Cook 92].

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A closer look at ICC

- ▶ Borrows techniques and results from Mathematical Logic:
 - Recursion Theory (Restriction of primitive recursion schema);
 - Proof Theory (Curry-Howard correspondence);
 - Model Theory (Finite model theory).
- ▶ **One of the goals:** It aims to define programming language tools (e.g., type-systems) where runtime of programs can be statically certified.
- ▶ Pervasive notion of **stratification**: data are organized into *strata* (Bellantoni's safe recursion [Bellantoni and Cook 92], Leivant's predicative/ramified/tiered recursion [Leivant 95]).

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Some caveats. . .

- ▶ This lecture is about FPTIME (= functions computed in polynomial time).
 - languages accepted vs **functions computed**
 - **time complexity** vs space complexity
 - linear, **polynomial**, exponential, . . .
- ▶ Recursion-theoretic approach to characterise FPTIME in the style of ICC:
 - Algebra of primitive recursive functions **PR**
 - **Problem:** find weaker algebra of functions $X \subsetneq \mathbf{PR}$ such that $X = \text{FPTIME}$
 - **Idea:** restrict primitive recursion scheme
- ▶ Stepwise approach:
 - From primitive recursion to bounded recursion (on notation) \rightarrow **machine-free**
 - Safe recursion on notation \rightarrow **machine-free + bound-free = ICC**

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A recap of primitive recursive functions

PR is the smallest class of number-theoretic functions such that:

► It contains the *basic functions*

- Constant zero: $0 \in \mathbb{N}$
- Successor: $S : \mathbb{N} \rightarrow \mathbb{N}$, $S(x) = x + 1$
- Projections: for any $k \in \mathbb{N}$ and $i \leq k$, $\pi_i^k : \mathbb{N}^k \rightarrow \mathbb{N}$, $\pi_i^k(x_1, \dots, x_k) = x_i$

► It is closed under the *composition scheme*:

- from $h : \mathbb{N}^{n+1} \rightarrow \mathbb{N}$ and $g : \mathbb{N}^n \rightarrow \mathbb{N}$ define $f : \mathbb{N}^n \rightarrow \mathbb{N}$ such that:

$$f(\vec{x}) = h(\vec{x}, g(\vec{x}))$$

► It is closed under the *primitive recursion scheme*:

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$$\begin{aligned}f(0, \vec{y}) &= g(\vec{y}) \\f(S(x), \vec{y}) &= h(x, \vec{y}, f(x, \vec{y}))\end{aligned}$$

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Recursive functions as a machine model

- ▶ Original goal: **extensional** definition as a class of functions
- ▶ Natural operational interpretation as **rewriting**
- ▶ **However:** no notion of constant time elementary step.
- ▶ Rewriting involves duplication of data of arbitrary size and of computations of arbitrary length.
- ▶ Need of non trivial data structures (stack) to (naïvely) implement primitive recursion.

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A notational problem

- ▶ Complexity classes defined for **binary** strings (e.g. 1001)
- ▶ Binary representation of natural numbers:

$$n \mapsto |n|$$
$$9 = ||||| \mapsto 1001$$

where $|n| \approx \log n$

- ▶ Usual recursion is on **unary** notation:

$$\text{linear in } n = \text{exponential in } |n|$$

indeed $n = 2^{\log n} \approx 2^{|n|}$

- ▶ **Solution:** recursion on (binary) notation.

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- ▶ **Solution:** recursion on **(binary) notation**.

Recursion on notation

- ▶ Data: natural numbers
- ▶ Two “successors”:
 - $s_0(n) = 2n$ (i.e. adding 0 at the least significant position)
 - $s_1(n) = 2n + 1$ (i.e. adding 1 at the least significant position)

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Recursion on notation is too generous

- ▶ Function $\text{double}(x)$ such that $|\text{double}(x)| = 2 \cdot |x|$:

$$\begin{aligned}\text{double}(0) &= 1 \\ \text{double}(s_0(x)) &= s_0(s_0(\text{double}(x))) & x \neq 0 \\ \text{double}(s_1(x)) &= s_0(s_0(\text{double}(x)))\end{aligned}$$

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Bounded recursion on notation (Cobham 1965)

► *Bounded recursion on notation:*

- from $g : \mathbb{N}^n \rightarrow \mathbb{N}$ and $h_0, h_1 : \mathbb{N}^{n+2} \rightarrow \mathbb{N}$ and $k : \mathbb{N}^{n+1} \rightarrow \mathbb{N}$

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provided $f(x, \vec{y}) \leq k(x, \vec{y})$.

► We need an extra basic function to achieve the desired growth rate:

$$x \# y = 2^{|\cdot| \cdot |\cdot|}$$

BRN is the smallest class of number-theoretic functions such that:

- It contains the basic functions (zero, successor, projections) and *smash function*.
- It is closed under the composition scheme.
- It is closed under the *bounded recursion on notation* scheme.

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BRN is an algebra of polytime computable functions

Theorem (Cobham, 65)

BRN = FPTIME.

- ▶ **FPTIME \subseteq BRN:** Code TMs as functions of the algebra. The iteration of the transition function is representable because a priori polynomially bounded.
- ▶ **BRN \subseteq FPTIME:** By induction on the length of the definition, show that any function is computable by a polynomially bounded TM, exploiting the bound on the recursive definition.

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A critique to Cobham characterization

- ▶ Cobham's paper is the birth of computational complexity as a respected theory, as it characterized FPTIME as a mathematically meaningful class.
- ▶ **However:** from the implicit computational complexity perspective, it is not as implicit as it seems:
 - It uses an explicit a priori bound on the construction
 - It “throws in” the polynomials (i.e., the \sharp function) in the recipe, in order to make it work.
- ▶ We had to wait until the '90s to get a more “implicit” characterization of FPTIME...

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Safe recursion: idea

- ▶ Analysis of the exponential function $\exp(x)$: recursive call of \exp is in turn recursive parameter of $\text{double}(x)$.
- ▶ Different strategy to control the growth of function:

bounded recursion \rightsquigarrow unbounded recursion + stratification (safe/normal)

- ▶ Function arguments are partitioned into **normal** and **safe**:

$$f(x_1, \dots, x_n; y_1, \dots, y_m)$$

- ▶ Safe recursion on notation:

$$\begin{aligned}f(0, \vec{x}; \vec{y}) &= g(\vec{x}; \vec{y}) \\f(s_0x, \vec{x}; \vec{y}) &= h_0(x, \vec{x}; \vec{y}, f(x, \vec{x}; \vec{y})) \\f(s_1x, \vec{x}; \vec{y}) &= h_1(x, \vec{x}; \vec{y}, f(x, \vec{x}; \vec{y}))\end{aligned}$$

- ▶ **Idea:** recursive call $f(x, \vec{x}; \vec{y})$ is never the recursive parameter of h_i .

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Safe composition

► Composition is constrained to respect this partition.

► Safe composition:

$$f(\vec{x}; \vec{y}) = h(\vec{x}; g(\vec{x}; \vec{y}))$$

$$f(\vec{x}; \vec{y}) = h(g(\vec{x};); \vec{y}) \quad \text{no safe parameters in } g!$$

► **Idea:** We can move a **normal** argument in **safe** position but not vice versa:

$$h(\mathbf{x}; \mathbf{y}) \mapsto f(\mathbf{x}; \mathbf{x}) : \quad f(\mathbf{x}; \mathbf{x}) = h(\mathbf{x}; \pi_1^1(\mathbf{x};)) = h(\mathbf{x}; \mathbf{x})$$

$$h(\mathbf{x}; \mathbf{y}) \not\mapsto f(\mathbf{y}; \mathbf{y}) : \quad f(\mathbf{y}; \mathbf{y}) \neq h(\pi_1^1(; \mathbf{y}); \mathbf{y}) = h(\mathbf{y}; \mathbf{y})$$

The algebra of function **BC**

BC is the smallest class of number-theoretic functions such that:

► It contains the following basic functions:

- Constant zero: 0
- Successors: $s_0(; x) = 2 \cdot x$ and $s_1(; x) = 2 \cdot x + 1$
- Projections: $\pi_{i;}^{n,m}(x_1, \dots, x_n; y_1, \dots, y_m) = x_i$ and $\pi_{j;}^{n,m}(x_1, \dots, x_n; y_1, \dots, y_m) = y_j$
- Predecessor: $P(; 0) = 0$ and $P(; s_i(x)) = x$
- Conditional:

$$C(; x, y, z) = \begin{cases} y & \text{if } x = s_0(x') \\ z & \text{if } x = s_1(x') \end{cases}$$

► It is closed under *safe recursion on notation* and *safe composition*.

BC is an algebra of polytime computable functions

Theorem (Bellantoni and Cook, 92)

$f(\vec{x};) \in \mathbf{BC}$ iff $f(\vec{x}) \in \mathbf{BRN}$.

► if $f(\vec{x};) \in \mathbf{BC}$ then $f(\vec{x}) \in \mathbf{BRN}$:

- For any $f(\vec{x};) \in \mathbf{BC}$ there is a polynomial q_f such that

$$|f(\vec{x}; \vec{y})| \leq q_f(|\vec{x}|) + \max(|\vec{y}|) \quad q_f \text{ polynomial}$$

- Observe that such q_f are definable in **BRN**
- Thus, *safe recursion on notation* instance of *bounded recursion on notation*.

► If $f(\vec{x}) \in \mathbf{BRN}$ then $f(\vec{x};) \in \mathbf{BC}$.

- By induction on derivation on Cobham's system, show that for any $f(\vec{x}) \in \mathbf{BRN}$ there is a function $h(w; \vec{x}) \in \mathbf{BC}$ and a polynomial p_f such that $h(w; \vec{x}) = f(\vec{x})$ for all \vec{x} and for any $w \geq p_f(|\vec{x}|)$
- Now construct a function $b(\vec{x};) \in \mathbf{BC}$ such that $b(\vec{x};) \geq p_f(|\vec{x}|)$
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Thank you!
Questions?