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#### Aim

inspired by a linear logic based characterization (LLL) of the PTIME class.



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Design a concrete functional language for polynomial time computations inspired by a linear logic based characterization (LLL) of the PTIME class.



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#### Outline

- Introduction and background: Light Linear Logic
- Light linear Programming Language (LPL) and its Type System
- Main results and proof ideas

## The general setting

• Implicit Computational Complexity (ICC) aims at characterizing complexity properties by restrictions on programming languages constructions.

General goals:

- characterize complexity classes of functions, e.g. PTIME, PSPACE
- design methods to statically guarantee complexity properties of programs

## The general setting

• Implicit Computational Complexity (ICC) aims at characterizing complexity properties by restrictions on programming languages constructions.

General goals:

- characterize complexity classes of functions, e.g. PTIME, PSPACE
- design methods to statically guarantee complexity properties of programs
- It generally borrows techniques from Mathematical Logic :
  - Recursion Theory
  - Structural Proof Theory
  - Model Theory

 light linear logic approach (LLL [Girard 98], SLL [Lafont 04]): provide term languages (λ-light [Terui 01], λ-soft [Baillot-Mogbil 04]) or type systems as criteria (DLAL [Baillot-Terui 09], STA [Gaboardi-Ronchi della Rocha 07]),

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# PROS: Proof-as-program paradigm $\Rightarrow$ higher-order and polymorphism. CONS: Algorithms represented are limited: not so user-friendly.

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- ramification [Bellantoni-Cook 92, Leivant 91] approach and/or inspired from system T (safe recursion with higher-order types SLR [Hofmann 00, Bellantoni-Niggl-Schwichtenberg 00], linear HO [Dal Lago-Martini-Roversi 03, Dal Lago 09]), non-size-increasing LFPL [Hofmann 99]).

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CONS: higher-order is quite constrained (linearity), AND/OR: from system T  $\Rightarrow$  not easy to program, far from ordinary functional languages.

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Functional characterization of the class PTIME

#### 1st Order Calculi:

 Quasi-interpretations [Marion-Moyen 00, Bonfante-Marion-Moyen 01, Amadio 05] and sup-interpretations [Marion-Péchoux 08,09] provide functional languages with recursion and pattern matching.

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#### 1st Order Calculi:

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PROS: expressivity on the considered programs, thanks to a combined criterion: *termination condition* + *size bound*. CONS: no higher-order, type checking easier than checking of quasi/sup-interpretations.

## Bring together the PROS ?

Refined goals:

• using LLL to bring together higher-order and recursion style programming, with pattern-matching, in a functional language with guaranteed PTIME bounds

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• using LLL to bring together higher-order and recursion style programming, with pattern-matching, in a functional language with guaranteed PTIME bounds



#### Approach:

- we are not aiming at an encoding of a language into LLL or DLAL
- we would follow LLL architecture and principles
- we would combine syntactic and typing conditions

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A difficulty in dealing with  $\lambda$ -calculus and recursion

We can easily combine apparently harmless terms to obtain exponential blow up.

#### Example 1

Take the recursive definition of mul on numerals  $\underline{\mathtt{n}}$  and consider:

$$\lambda x.x(\lambda y. mul \underline{2} y)\underline{1}$$

It is apparently harmless!

But for each Church numeral  $c_n = \lambda s . \lambda z . s^n z$  it returns the numeral  $2^n$ .

A tight control on both recursive calls and  $\beta$ -reduction steps is needed.

A difficulty in dealing with  $\lambda$ -calculus and recursion

We can easily combine apparently harmless terms to obtain exponential blow up.

#### Example 2

Take ListOf2 that given numeral  $\underline{n}$  returns a list of 2 of length n and foldr defined as usual. The following term is exponential in its argument.

```
\lambda x.foldr mul 1 (ListOf2 x)
```

Types can be used to prevent this.

## Light Linear Logic (LLL)

Types we use here:

The logical rules (for modalities ! and  $\S$ ) imply that:

- a non-linear argument (of a  $!A \multimap B$ ) has at most one free variable
- iteration:

$$\frac{step: A \multimap A}{\mathbb{N} \multimap \S A} base: \S A$$

an iteration cannot be used as the step of another iteration

type	time bound	size bound on result
$\mathbb{N} \multimap \mathbb{N}$	$O(n^2)$	<i>O</i> ( <i>n</i> )
$\mathbb{N} \multimap \S \mathbb{N}$	$O(n^4)$	$O(n^4)$
$\mathbb{N} \multimap \S^d \mathbb{N}$	$O(n^{2^{d+1}})$	$O(n^{2^{d+1}})$

## LLL proof nets

- Every proof-net Π has a maximal level d (depth) and is stratified into levels 0, 1, ..., d
  - level *i* does not depend from levels j > i
  - potential complexity: contraction nodes, i.e. a contraction node at level *i* can duplicate objects at levels *j* > *i*
- The evaluation can be done level-by-level, in successive rounds: 0, 1, ..., *d*.
- After the round at each level, the size increases quadratically.
- We get an overall bound  $O(|\Pi|^{2^d})$  both for size and computation time.

**Note**: in LLL, data types have a fixed depth. This means that the exponent d depends just on the program part, hence we can work in polynomial time.

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## LPL: a small functional programming language

The Language:

M, N	::=	$x \mid c t_1 \cdots t_n \mid X \mid F t_1 \cdots t_n \mid \lambda x.M \mid MM$	terms
v	::=	$c v_1 \cdots v_n$	values
t	::=	$X \mid c t_1 \dots t_n$	patterns
$d_{\rm F}$	::=	$F t_1 \dots t_n = N$	function def.
р	::=	$M \mid \texttt{LetRec} \ d_F,, d_F \ \texttt{in} \ \texttt{p}$	programs

- There is no mutually defined functions
- the scope of LetRec is static and global.
- Patterns are linear: X occurs at most once in c t<sub>1</sub> ... t<sub>n</sub>
- We consider a reduction mechanism consisting in the usual β-reduction and a LetRec<sub>F</sub> matching reduction.

#### Examples

• Addition:

LetRec Add 
$$(x + 1) y = (Add x y) + 1$$
,  
Add 0  $y = y$   
in Add (Add 3 2) 4

• Map:

Let Rec Map f 
$$(x : xs) = (fx) : (Map f xs)$$
,  
Map f nil = nil  
in Map  $(+1) (1 : 1 : 0 : 1)$ 

Append on lists:

LetRec Append (x : xs) ys = x: (Append xs ys), Append nil ys = ysin Append (Append (1 : nil) (0 : 1 : nil)) (1 : nil)

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## The combined criterion

#### The difficulty:

A reduction mixing of  $\beta$ -reduction and rewriting (LetRec<sub>F</sub>).

The solution:

**Combined Criterion** 

Syntactic Termination Condition

Controlling the number of recursive steps for individual recursive calls Light Linear Typing Condition

Controlling  $\beta$ -steps and the nesting of recursions

#### The syntactic criterion

The syntactic termination criterion checks for every definition:

$$F t_1 \dots t_n = M$$

that

each recursive call F  $\mathtt{t}_1^i\ldots \mathtt{t}_n^i$  in the term M

is done on a distinct strict sub-pattern of  $t_1 \dots t_n$ .

```
Div (s (s X)) = s (Div X)
Div (s 0) = 0
Div 0 = 0
Min (s X) (s Y) = s (Min X Y)
Min (s X) 0 = 0
Min 0 (s Y) = 0
```

#### The syntactic criterion

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But also as:

 $\label{eq:Foldr} \begin{array}{ll} F \ Z \ (X: XS) = F \ X \ (Foldr \ F \ Z \ XS) \ , \quad X: XS \ is \ a \ recurrence \ arg. \\ Foldr \ F \ Z \ nil = Z \end{array}$ 

Tadd (node X L R) (node X' L' R') = node (X + X') (Tadd L L') (Tadd R R') Tadd  $\epsilon$  X = X Tadd X  $\epsilon$  = X

### Typing condition

The LPL types are:

Typing rules for constructors and function symbols:

$$\overline{\vdash \mathsf{c}:\mathcal{T}(\mathsf{c})}$$
  $\overline{\vdash \mathsf{F}:\mathcal{T}(\mathsf{F})}$ 

• constructors:  $\mathcal{T}(c) = \mathbb{D}_1 \multimap \cdots \multimap \mathbb{D}_n \multimap \mathbb{D}_{n+1}$ 

• functions: where  $!^{i} \S^{j}$  is denoted by  $\dagger^{i+j}$ ,

$$\mathcal{T}(\mathbf{F}) = \dagger^{i_1} A_1 \multimap \cdots \multimap \dagger^{i_n} A_n \multimap \S^j A$$

- for every recurrence argument k we have  $i_k = 0$
- for every other argument r we have  $i_r \ge 1$

Image: A math a math

## Typing rules

 $\lambda$ -calculus part: DLAL (extended to pattern variables) Recursive definitions and programs:

$$\begin{array}{rcl} \displaystyle \underline{\Theta_1; \Theta_2 \ \vdash \ F \ \overrightarrow{t} : C & \Theta_1; \Theta_2 \ \vdash \ N : C \\ & \rhd \ (F \ \overrightarrow{t} \ = \ N) : C \\ \end{array} \\ \displaystyle \frac{ \Gamma; \Delta \ \vdash \ p : C & \rhd \ d_F : C \ \cdots \ \rhd \ d_F : C \\ & \ LetRec \ d_F, ..., d_F \ in \ p \end{array} (R) \end{array}$$

- in (D):  $\Theta_1, \Theta_2$  only contain pattern variables
- ( $\star$ ): condition on the recurrence arguments should be satisfied

## Examples of types

• some function types:

$$\begin{array}{rcl} \operatorname{Add} (x+1) \ y &=& (\operatorname{Add} x \ y)+1 \ , \\ & \operatorname{Add} 0 \ y &=& y \\ & \vdash \operatorname{Add} &:& \mathbb{N} \multimap \S \mathbb{N} \multimap \S \mathbb{N} \\ & \operatorname{Map} \ f \ (x:xs) \ =&& (fx) : (\operatorname{Map} \ f \ xs) \ , \\ & \operatorname{Map} \ f \ nil \ =&& nil \\ & \vdash \operatorname{Map} \ :& !(\mathbb{N} \multimap \mathbb{N}) \multimap \mathbb{L} \multimap \S \mathbb{L} \\ & \operatorname{Foldr} \ f \ z \ nil \ =& z \\ & \vdash \operatorname{Foldr} \ :& !(\mathbb{N} \multimap \S \mathbb{N} \multimap \S \mathbb{N}) \multimap \S \mathbb{S} \mathbb{N} \multimap \mathbb{L} \multimap \S \S \mathbb{N} \end{array}$$

• example of program type:

LetRec  $d_{Add}$ ,  $d_{Foldr}$  in Foldr ( $\lambda x. \lambda y. Add x y$ ) 0 (0:1:...:n): §§N

Image: Image:

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From typed programs to executable terms

The normalization proof idea: Adapting the proof for LLL:

- replace proof-net depth by a new invariant: potential depth d
- reduction strategy: stratified reduction, i.e. depth 0, 1, ..., d
- at each depth *i*, we use 2 measures:
  - $|s|_i$  to bound  $\beta$  steps and  $SA_i^F(M)$  to bound LetRec<sub>F</sub> steps

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## Results

#### Theorem (Soundness)

Consider a program  $p = LetRec d_{F_1}, \dots d_{F_n}$  in M satisfying:

- the syntactic criterion
- the typing condition, with potential depth d,

then there exists a polynomial P such that p can be reduced in a number of steps bounded by P(|p|). The polynomial P only depends on the potential depth d.

In particular, if  $p : \mathbb{W} \multimap \S^k \mathbb{W}$  then p represents a PTIME function.

#### Theorem (Completeness)

For any PTIME function  $f : \{0,1\}^* \to \{0,1\}^*$ , there exists an integer k and an LPL program of type  $\mathbb{W} \to \S^k \mathbb{W}$ , representing f.

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#### Conclusion and perspectives

- We have defined a higher-order functional language with recursively defined functions and with a criterion for Ptime.
- This is a setting in which the techniques coming from different approaches (quasi-interpretations, non-size-increasing, linear logic) could be combined.
- The bound induced by typing is rough, but it could be efficiently inferred.
- Some improvements:
  - both the syntactic and typing criterion can be relaxed
  - integer and symbolic constraints can be added to achieve finer bounds
- Perspectives for functional languages:
  - space resource analysis
  - resource control techniques