

# An introduction to light logics, or Implicit complexity by taming the duplication

Patrick Baillot

CNRS / ENS Lyon

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# Introduction

- Implicit computational complexity (ICC) :  
characterizing complexity classes by programming languages /  
calculi without explicit bounds,  
but instead by restricting the constructions
- either theory-oriented or certification-oriented
- often conveniently formulated by:  
(i) a general programming language, (ii) a criterion on  
programs

# Various approaches to ICC

- ramified recursion (Leivant, Leivant-Marion) / safe recursion (Bellantoni-Cook)
- variants of linear logic (light logics) **this talk**
- interpretation methods
- ...

# ICC vs. complexity analysis

specificities of ICC w.r.t. automatic complexity analysis:

- complexity certificate (e.g. type)
- modular

but

- only rough complexity bounds
- less general analysis (specific programming discipline)

## The proofs-as-programs viewpoint

- our reference language here is  $\lambda$ -calculus  
untyped  $\lambda$ -calculus is Turing-complete
- type systems can guarantee termination  
ex: system F (polymorphic types)
- proofs-as-programs correspondence
  - proof = type derivation
  - normalization = execution
  - intuitionistic logic  $\leftrightarrow$  system F
- some characteristics of  $\lambda$ -calculus:
  - higher-order types
  - no distinction between data / program

# Linear logic

- linear logic (LL):  
fine-grained decomposition of intuitionistic logic  
duplication is controlled with a specific connective !  
(exponential)
- variants of linear logic with different rules for ! have bounded complexity: light logics  
these logics (or subsystems) can be used as type systems for  $\lambda$ -calculus  
thus:  
(i) general language =  $\lambda$ -calculus, (ii) criterion = typability

# Outline of the talk

- 1 a recap on  $\lambda$ -calculus and system F
- 2 elementary linear logic (ELL): elementary complexity
- 3 light linear logic (LLL): Ptime complexity
- 4 other linear logic variants
- 5 conclusion

# $\lambda$ -calculus

- $\lambda$ -terms:

$$t, u ::= x \mid \lambda x. t \mid t u$$

notations:  $\lambda x_1 x_2. t$  for  $\lambda x_1. \lambda x_2. t$

$(t u v)$  for  $((t u) v)$

substitution:  $t[u/x]$

- $\beta$ -reduction:

$\xrightarrow{1}$  relation obtained by context-closure of:

$$((\lambda x. t)u) \xrightarrow{1} t[u/x]$$

$\rightarrow$  reflexive and transitive closure of  $\xrightarrow{1}$ .



# Typed $\lambda$ -terms

system F types:

$$T, U ::= \alpha \mid T \rightarrow U \mid \forall \alpha. T$$

simple types: without  $\forall$

simply typed terms, in Church-style:

$$x^T \quad (\lambda x^T. M^U)^{T \rightarrow U} \quad ((M^{T \rightarrow U}) N^T)^U$$

# Proofs-programs correspondence (Curry-Howard)

**typed term**

$\Rightarrow$

**2nd-order intuitionistic  
logic proof**

type

formula

$M^B$ , with  
free variables  $x_i : A_i$ ,  $1 \leq i \leq n$

proof of  $A_1, \dots, A_n \vdash B$

$\beta$ -reduction of term

normalization of proof  
(cut elimination)

## Some types and data types

Polymorphic identity:

$$\lambda x^\alpha. x \quad : \quad \forall \alpha. (\alpha \rightarrow \alpha)$$

Church unary integers:

$$N^F \quad = \quad \forall \alpha. (\alpha \rightarrow \alpha) \rightarrow (\alpha \rightarrow \alpha)$$

example

$$\underline{2} \quad = \quad \lambda f^{\alpha \rightarrow \alpha}. \lambda x^\alpha. (f (f x)) : N^F$$

Church binary words:

$$W^F \quad = \quad \forall \alpha. (\alpha \rightarrow \alpha) \rightarrow (\alpha \rightarrow \alpha) \rightarrow (\alpha \rightarrow \alpha)$$

example

$$\underline{\langle 1, 1, 0 \rangle} \quad = \quad \lambda s_0^{\alpha \rightarrow \alpha}. \lambda s_1^{\alpha \rightarrow \alpha}. \lambda x^\alpha. (s_1 (s_1 (s_0 x))) : W^F$$

# Iteration

For each inductive data type an associated iteration principle.  
For instance, for  $N = \forall\alpha.(\alpha \rightarrow \alpha) \rightarrow (\alpha \rightarrow \alpha)$ , we can define an iterator *iter*:

$$\text{iter} = \lambda f x n. (n \ f \ x) : (A \rightarrow A) \rightarrow A \rightarrow N \rightarrow A, \quad \text{for any } A$$

then

$$(\text{iter } t \ u \ \underline{n}) \rightarrow (t \ (t \ \dots \ (t \ u) \ \dots)) \quad (n \ \text{times})$$

**example:**

$$\text{double} : N \rightarrow N$$

$$\text{exp} = \lambda n. (\text{iter } \text{double} \ \underline{1} \ n) : N \rightarrow N$$

$$\text{tower} = \lambda n. (\text{iter } \text{exp} \ \underline{1} \ n) : N \rightarrow N$$

## Examples of terms

concatenation

$$\begin{aligned} \text{conc} &= \lambda u^W. \lambda v^W. \lambda s_0. \lambda s_1. \lambda x. (u \ s_0 \ s_1) \ (v \ s_0 \ s_1 \ x) \\ &: W \rightarrow W \rightarrow W \end{aligned}$$

length

$$\begin{aligned} \text{length} &= \lambda u^W. \lambda f^{\alpha \rightarrow \alpha}. (u \ f \ f)^{\alpha \rightarrow \alpha} \\ &: W \rightarrow N \end{aligned}$$

repeated concatenation

$$\begin{aligned} \text{rep} &= \lambda n^N. \lambda v^W. [n \ (\text{conc} \ v) \ \underline{\text{nil}}]^W \\ &: N \rightarrow W \rightarrow W \end{aligned}$$

## System F and termination

### Theorem (Girard)

If a term is well typed in  $F$ , then it is strongly normalizable.

Thus a type derivation can be seen as a termination witness.  
In particular, a term  $t : W \rightarrow W$  represents a function on words which terminates on all inputs.

Can we refine this system in order to guarantee feasible termination, that is to say in polynomial time?

# Linear logic

- Linear logic (LL) arises from the decomposition

$$A \Rightarrow B \equiv !A \multimap B$$

- the ! modality accounts for duplication (contraction)
- ! satisfies the following principles:

$$!A \multimap !A \otimes !A \qquad \frac{A \vdash B}{!A \vdash !B} \qquad !A \multimap A$$

$$!A \otimes !B \multimap !(A \otimes B) \qquad !A \multimap !!A$$

# Elementary linear logic (ELL) [Girard95]

- Language of formulas:

$$A, B := \alpha \mid A \multimap B \mid !A \mid \forall \alpha. A$$

Denote  $!^k A$  for  $k$  occurrences of  $!$ .

- The system is designed in such a way that the following principles are **not** provable

$$!A \multimap A, \quad !A \multimap !!A$$

- Defined to characterize elementary time complexity, that is to say in time bounded by  $2_k^n$ , for arbitrary  $k$ .



## Elementary linear logic rules

$$\frac{}{x : A \vdash x : A} \text{ (Id)}$$

$$\frac{\Gamma, x : A \vdash t : B}{\Gamma \vdash \lambda x. t : A \multimap B} \text{ } (\multimap \text{ i})$$

$$\frac{\Gamma_1 \vdash t : A \multimap B \quad \Gamma_2 \vdash u : A}{\Gamma_1, \Gamma_2 \vdash (t u) : B} \text{ } (\multimap \text{ e})$$

$$\frac{x_1 : !A, x_2 : !A, \Gamma \vdash t : B}{x : !A, \Gamma \vdash t[x/x_1, x/x_2] : B} \text{ (Cntr)}$$

$$\frac{\Gamma \vdash t : A}{\Gamma, x : B \vdash t : A} \text{ (Weak)}$$

$$\frac{x_1 : B_1, \dots, x_n : B_n \vdash t : A}{x_1 : !B_1, \dots, x_n : !B_n \vdash t : !A} \text{ } (! \text{ i})$$

$$\frac{\Gamma_1 \vdash u : !A \quad \Gamma_2, x : !A \vdash t : B}{\Gamma_1, \Gamma_2 \vdash t[u/x] : B} \text{ } (! \text{ e})$$

## Forgetful map from ELL to F

Consider  $(.)^- : ELL \rightarrow F$  defined by:

$$(!A)^- = A^-, \quad (A \multimap B)^- = A^- \rightarrow B^-, \quad (\forall \alpha. A)^- = \forall \alpha. A^-, \quad \alpha^- = \alpha.$$

### Proposition

If  $\Gamma \vdash_{ELL} t : A$  then  $t$  is typable in F with type  $A^-$ .

If  $A^- = T$ , say  $A$  is a decoration of  $T$  in ELL.

# Data types in ELL

- Church unary integers

system F:

$$N^F$$

$$\forall \alpha. (\alpha \rightarrow \alpha) \rightarrow (\alpha \rightarrow \alpha)$$

ELL:

$$N^{ELL}$$

$$\forall \alpha. !(\alpha \multimap \alpha) \multimap !(\alpha \multimap \alpha)$$

Example: integer 2, in F:

$$\underline{2} = \lambda f^{(\alpha \rightarrow \alpha)}. \lambda x^\alpha. (f (f x)) .$$

- Church binary words

system F:

$$W^F$$

$$\forall \alpha. (\alpha \rightarrow \alpha) \rightarrow (\alpha \rightarrow \alpha) \rightarrow (\alpha \rightarrow \alpha)$$

ELL:

$$W^{ELL}$$

$$\forall \alpha. !(\alpha \multimap \alpha) \multimap !(\alpha \multimap \alpha) \multimap !(\alpha \multimap \alpha)$$

Example:  $w = \langle 1, 0, 0 \rangle$ , in F:

$$\underline{w} = \lambda s_0^{(\alpha \rightarrow \alpha)}. \lambda s_1^{(\alpha \rightarrow \alpha)}. \lambda x^\alpha. (s_1 (s_0 (s_0 x))) .$$

## Representation of functions

- a term  $t$  of type  $!^k N \multimap !^l N$ , for some  $k, l$ , represents a function over unary integers
- some examples of terms

addition

$$\begin{aligned} \text{add} &= \lambda n m f x. (n f) (m f x) \\ &: N \multimap N \multimap N \end{aligned}$$

multiplication

$$\begin{aligned} \text{mult} &= \lambda n m f. (n (m f)) \\ &: N \multimap N \multimap N \end{aligned}$$

squaring

$$\begin{aligned} \text{square} &= \lambda n f. (n (n f)) \\ &: !N \multimap !N \end{aligned}$$

## Iteration in ELL

recall the iterator *iter*:

$$\mathit{iter} = \lambda f x n. (n f x) : !(A \multimap A) \multimap !A \multimap N \multimap !A$$

with  $(\mathit{iter} t u n) \rightarrow (t (t \dots (t u) \dots))$  ( $n$  times)

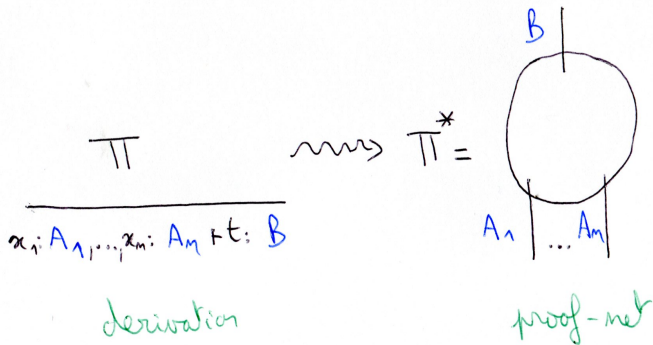
**examples:**

*double* :  $N \multimap N$

*exp* =  $(\mathit{iter} \mathit{double} \underline{1}) : N \multimap !N$

remark: *exp* cannot be iterated; *tower* =  $(\mathit{iter} \mathit{exp} \underline{1})$  non ELL typable.

# From derivations to proof-nets



## Elementary linear logic rules, again

$$\frac{}{x : A \vdash x : A} \text{ (Id)}$$

$$\frac{\Gamma, x : A \vdash t : B}{\Gamma \vdash \lambda x. t : A \multimap B} \text{ } (\multimap \text{ i})$$

$$\frac{\Gamma_1 \vdash t : A \multimap B \quad \Gamma_2 \vdash u : A}{\Gamma_1, \Gamma_2 \vdash (t u) : B} \text{ } (\multimap \text{ e})$$

$$\frac{x_1 : !A, x_2 : !A, \Gamma \vdash t : B}{x : !A, \Gamma \vdash t[x/x_1, x/x_2] : B} \text{ (Cntr)}$$

$$\frac{\Gamma \vdash t : A}{\Gamma, x : B \vdash t : A} \text{ (Weak)}$$

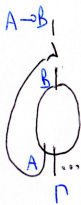
$$\frac{x_1 : B_1, \dots, x_n : B_n \vdash t : A}{x_1 : !B_1, \dots, x_n : !B_n \vdash t : !A} \text{ } (! \text{ i})$$

$$\frac{\Gamma_1 \vdash u : !A \quad \Gamma_2, x : !A \vdash t : B}{\Gamma_1, \Gamma_2 \vdash t[u/x] : B} \text{ } (! \text{ e})$$

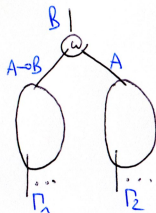
# ELL Proof-Nets



(Id)



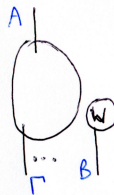
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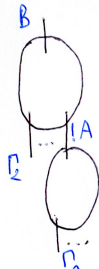
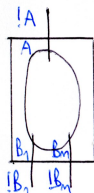
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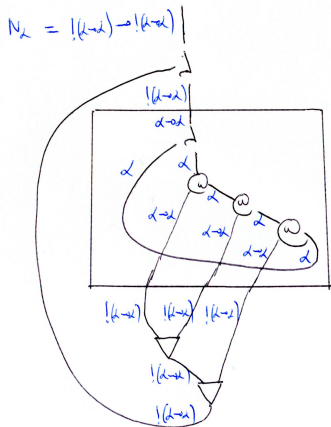
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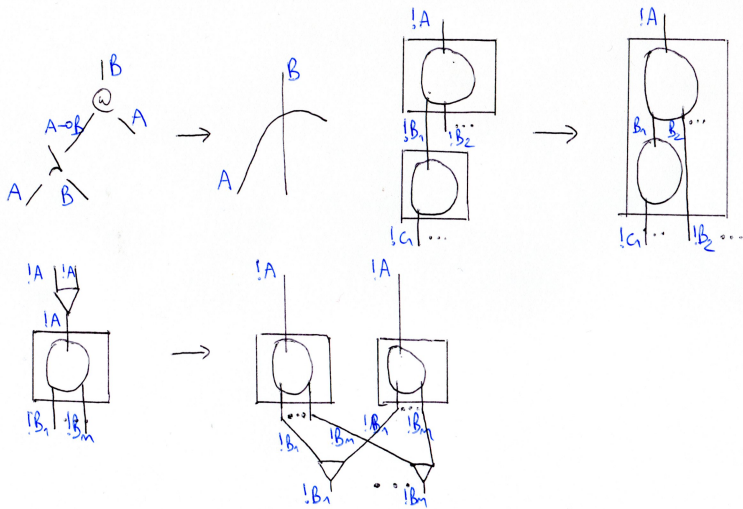


# ELL proof-net : example

Church integer 3:



# ELL proof-net reduction



# Methodology

- write programs with ELL typed  $\lambda$ -terms
  - evaluate them by:
    - compiling them into proof-nets, and then performing proof-net reduction
  - beware:
    - proof-net reduction does not exactly match  $\beta$ -reduction
    - ELL does not satisfy subject reduction
- but that's all right for our present goal . . .
- More about that in tomorrow's talk, without proof-nets.

## ELL proof-net reduction properties

- We have

### Proposition (Stratification)

The depth of an edge does not change during reduction.

Consequence: the depth  $d$  of a proof-net does not increase during reduction.

- **Level-by-level reduction strategy:**

$R$  proof-net of depth  $d$

perform reduction successively at depth  $0, 1 \dots, d$ .

## Level-by-level reduction of ELL proof-nets

- let  $R$  be an ELL proof-net of depth  $d$   
 $|R|_i$  = size at depth  $i$   
 $|R|$  = total size  
round  $i$ : reduction at depth  $i$   
there are  $d + 1$  rounds for the reduction of  $R$
- **what happens during round  $i$ ?**
  - $|R|_i$  decreases at each step  
thus there are at most  $|R|_i$  steps (size bounds time)
  - but  $|R|_{i+1}$  can increase at each step, in fact it can double
  - hence round  $i$  can cause an exponential size increase
- on the whole we have a  $2_d^{|R|}$  size increase
- this yields a  $O(2_d^{|R|})$  bound on the number of steps

## ELL complexity results

### Theorem (Proof-net complexity)

If  $R$  is an ELL proof-net of depth  $d$ , then it can be reduced to its normal form in  $O(2_d^{|R|})$  steps.

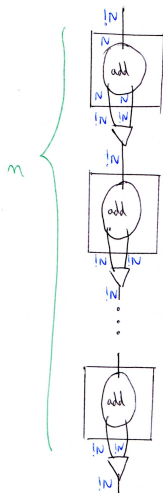
### Theorem (Representable functions)

The functions representable by a term of type  $N \multimap !^k N$ , where  $k \geq 0$ , are exactly the elementary time functions.

## Proof of the representability theorem

- $\subseteq$  (soundness):  
if  $t : N \multimap !^k N$  for some  $k$ , then  $t$  represents an elementary function  $f$ .  
**proof:** compute  $(t\underline{n})$  by proof-net reduction.
- $\supseteq$  (completeness):  
if  $f : \mathbb{N} \rightarrow \mathbb{N}$  is an elementary function, then there exists  $k$  and  $t : N \multimap !^k N$  such that  $t$  represents  $f$ .  
**proof:** simulation of  $O(2_i^n)$ -time bounded Turing machine, for any  $i$ .

# Taming the exponential blow-up?





# Light linear logic (LLL)

[Girard95]

- Language of formulas:

$$A, B := \alpha \mid A \multimap B \mid \forall \alpha. A \mid !A \mid \S A$$

intuition:  $\S$  a new modality for non-duplicable boxes

- The following principles are still **not** provable

$$!A \multimap A, \quad !A \multimap !!A$$

## Light linear logic rules

- rules (Id), ( $\multimap$  i), ( $\multimap$  e), (Cntr), (Weak): as in ELL.
- new rules (! i), (! e), ( $\S$  i), ( $\S$  e):

$$\frac{x : B \vdash t : A}{x : !B \vdash t : !A} (! i) \qquad \frac{\Gamma_1 \vdash u : !A \quad \Gamma_2, x : !A \vdash t : B}{\Gamma_1, \Gamma_2 \vdash t[u/x] : B} (! e)$$

$$\frac{\Gamma, \Delta \vdash t : A}{! \Gamma, \S \Delta \vdash t : \S A} (\S i) \qquad \frac{\Gamma_1 \vdash u : \S A \quad \Gamma_2, x : \S A \vdash t : B}{\Gamma_1, \Gamma_2 \vdash t[u/x] : B} (! e)$$

where if  $\Gamma = x_1 : B_1, \dots, x_k : B_k$ ,

$\dagger \Gamma = x_1 : \dagger B_1, \dots, x_k : \dagger B_k$ , for  $\dagger = !, \S$ .

## Forgetful map from LLL to ELL

Consider  $(.)^e : LLL \rightarrow ELL$  defined by:

$$(\&A)^e = !A^e, \quad (!A)^e = !A^e$$

and other connectives unchanged.

### Proposition

If  $\Gamma \vdash_{LLL} t : A$  then  $\Gamma^e \vdash_{ELL} t : A^e$ .

## Data types in LLL

- Church unary integers

system F:

$N^F$

$$\forall \alpha. (\alpha \rightarrow \alpha) \rightarrow (\alpha \rightarrow \alpha)$$

LLL:

$N^{LLL}$

$$\forall \alpha. !(\alpha \multimap \alpha) \multimap \S(\alpha \multimap \alpha)$$

Example: integer 2, in F:

$$\underline{2} = \lambda f^{(\alpha \rightarrow \alpha)}. \lambda x^\alpha. (f (f x)) .$$

- Church binary words

system F:

$W^F$

$$\forall \alpha. (\alpha \rightarrow \alpha) \rightarrow (\alpha \rightarrow \alpha) \rightarrow (\alpha \rightarrow \alpha)$$

LLL:

$W^{LLL}$

$$\forall \alpha. !(\alpha \multimap \alpha) \multimap !(\alpha \multimap \alpha) \multimap \S(\alpha \multimap \alpha)$$

Example:  $w = \langle 1, 0, 0 \rangle$ , in F:

$$\underline{w} = \lambda s_0^{(\alpha \rightarrow \alpha)}. \lambda s_1^{(\alpha \rightarrow \alpha)}. \lambda x^\alpha. (s_1 (s_0 (s_0 x))) .$$

## Representation of functions

- a term  $t$  of type  $!^k N \multimap \S^l N$ , for some  $k, l$ , represents a function over unary integers  
 $!^k W \multimap \S^l W$ : function over binary words.
- some examples of terms

addition

$$\begin{aligned} \text{add} &= \lambda n m f x. (n f) (m f x) \\ &: N \multimap N \multimap N \end{aligned}$$

double

$$\begin{aligned} \text{double} &= \lambda n f x. (n f) (n f x) \\ &: !N \multimap \S N \end{aligned}$$

concatenation

$$\text{conc} : W \multimap W \multimap W$$

## Iteration in LLL

we can type the iterator *iter*:

$$\mathit{iter} = \lambda f x n. (n \ f \ x) : !(A \multimap A) \multimap !A \multimap N \multimap \S A$$

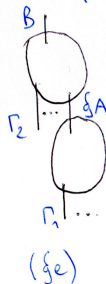
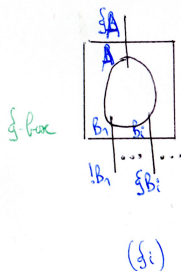
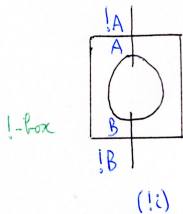
**examples:**

*(add3)* :  $N \multimap N$  can be iterated

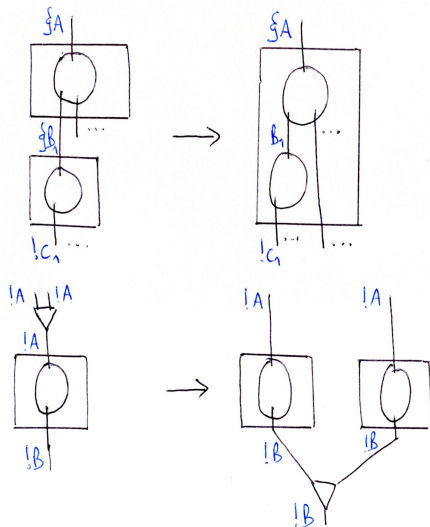
*double* :  $!N \multimap \S N$  cannot be iterated

thus some exponentially growing terms are not typable

# LLL proof-nets



# LLL proof-net reduction





## Level-by-level reduction of LLL proof-nets

- as in ELL we use a level-by-level strategy
- let  $R$  be an LLL proof-net of depth  $d$   
round  $i$ : reduction at depth  $i$   
there are  $d + 1$  rounds for the reduction of  $R$
- **what happens during round  $i$ ?**
  - $|R|_i$  decreases at each step  
thus there are at most  $|R|_i$  steps (size bounds time)
  - yet  $|R|_{i+1}$  can increase:  
during round  $i$  we can have a quadratic increase:

$$|R'|_{i+1} \leq |R|_{i+1}^2$$

- this repeats  $d$  times, so on the whole we have a  $|R|^{2^d}$  size increase
- this yields a  $O(|R|^{2^d})$  bound on the number of steps

## LLL complexity results

### Theorem (Proof-net complexity)

If  $R$  is an LLL proof-net of depth  $d$ , then it can be reduced to its normal form in  $O(|R|^{2^d})$  steps.

Thus at fixed depth  $d$  we have a polynomial bound.

### Theorem (Representable functions)

The functions representable by a term of type  $W \multimap \xi^k W$ , for  $k \geq 0$ , are exactly the functions of FP (polynomial time functions).

## Further comments about LLL

- **LLL and  $\lambda$ -calculus:**

a proper type system for  $\lambda$ -calculus can be designed out of LLL, which ensures a strong polynomial time bound on  $\beta$ -reduction (and not only on proof-net reduction)

- **about expressivity:**

the completeness result is an extensional one  
but the intensional expressivity of LLL is quite limited  
indeed: rich features (higher-order, polymorphism) but  
"pessimistic" account of iteration ...

## A glimpse of a linear logics zoo

- for P
  - soft linear logic: [Lafont04]  
a simple system, but with more constrained programming
  - bounded linear logic: [GSS92]  
 $!_{P(\vec{x})}A$  : more explicit, but more flexible
- for EXPTIME and  $k$ -EXPTIME
  - ELL again: see tomorrow's talk
- for PSPACE
  - $STA_B$  [GMRdR08] : extends soft linear logic with a craftly typed conditional
- for LOGSPACE
  - *IntML* [DLS10]: evaluation by computation by interaction

## Conclusions and perspectives

- while ramified recursion is based on a stratification of data, ELL / LLL are based on a stratification of programs
- they yield type systems for  $\lambda$ -calculus
- w.r.t. other ICC approaches:
  - handle higher-order computation
  - but limited intensional expressivity

relations with other ICC systems are still to explore

- light logics are languages for higher-order computation, but we only characterize first-order complexity classes ...  
what about higher-order complexity?