

# From finite semantics to regular languages (and beyond) in second-order linear logic

---

NGUYỄN Lê Thành Dũng (a.k.a. Tito) — [nltd@nguyentito.eu](mailto:nltd@nguyentito.eu)  
Laboratoire d'informatique de Paris Nord (LIPN), Université Paris 13  
joint work with Thomas SEILLER (CNRS, LIPN)  
ELICA project final meeting, Paris, October 11th, 2018

# Implicit complexity with proofs-as-programs

Curry-Howard approach to implicit complexity:

1. Define logic / programming language
2. Bound evaluation complexity (*soundness*)
3. Show language expressivity (*extensional completeness*)
4. Result: set of expressible functions = some complexity class

Step 1 requires creativity. Examples from linear logic:

LLL  $\rightsquigarrow$  polytime (Girard), SBAL  $\rightsquigarrow$  logspace (Schöpp)...

# Implicit complexity with proofs-as-programs

Curry-Howard approach to implicit complexity:

1. Define logic / programming language
2. Bound evaluation complexity (*soundness*)
3. Show language expressivity (*extensional completeness*)
4. Result: set of expressible functions = some complexity class

Step 1 requires creativity. Examples from linear logic:

LLL  $\rightsquigarrow$  polytime (Girard), SBAL  $\rightsquigarrow$  logspace (Schöpp)...

This talk: instead, ask (2)–(4) for well-known systems:

- simply typed  $\lambda$ -calculus (ST $\lambda$ )
  - recall old methods and results
- and later Elementary Linear Logic (ELL)
  - new results inspired by ST $\lambda$  techniques

...or rather, (naturally) restricted situations within ST $\lambda$ /ELL.

## Simply-typed $\lambda$ -calculus and implicit complexity?

Recall  $k$ -EXPTIME = DTIME(tower of exponentials of height  $k$ ),  
ELEMENTARY =  $\bigcup_{k \in \mathbb{N}} k$ -EXPTIME.

**Claim: ST $\lambda$  characterizes ELEMENTARY.**

Parameter controlling complexity: *functionality order*

$$\text{ord}(\alpha \rightarrow \beta) = \max(\text{ord}(\alpha) + 1, \text{ord}(\beta))$$

- Soundness:  $\forall k \in \mathbb{N} \exists f(k) \in \mathbb{N}$  s.t. normalization of  $\lambda$ -terms with order  $\leq k$  subterms is in  $f(k)$ -EXPTIME
- Extensional completeness: **naive attempt fails**

# Church encodings of inputs in $ST\lambda$

Church (or Böhm–Berarducci) encodings:

- For  $w \in \{0, 1\}^*$ ,  $w : \text{Str}[A]$  for any simple type  $A$  (meta- $\forall$ )
  - $\text{Str}[A] = (A \rightarrow A) \rightarrow (A \rightarrow A) \rightarrow (A \rightarrow A)$
  - $\bar{w} = \lambda f_0. \lambda f_1. \lambda x. f_{w[0]} (\dots (f_{w[n-1]} x) \dots)$
- $\text{Bool} = o \rightarrow o \rightarrow o$  ( $o$  base type)

Choose a simple type  $A$ , and a term  $t : \text{Str}[A] \rightarrow \text{Bool}$

$\longrightarrow$  defines language  $\mathcal{L}(t) = \{w \in \{0, 1\}^* \mid t \bar{w} \rightarrow_{\beta}^* \text{true}\}$ .

Not all ELEMENTARY languages possible... but then what?

# Church encodings of inputs in $ST\lambda$

Church (or Böhm–Berarducci) encodings:

- For  $w \in \{0, 1\}^*$ ,  $w : \text{Str}[A]$  for any simple type  $A$  (meta- $\forall$ )
  - $\text{Str}[A] = (A \rightarrow A) \rightarrow (A \rightarrow A) \rightarrow (A \rightarrow A)$
  - $\bar{w} = \lambda f_0. \lambda f_1. \lambda x. f_{w[0]} (\dots (f_{w[n-1]} x) \dots)$
- $\text{Bool} = o \rightarrow o \rightarrow o$  ( $o$  base type)

Choose a simple type  $A$ , and a term  $t : \text{Str}[A] \rightarrow \text{Bool}$

$\longrightarrow$  defines language  $\mathcal{L}(t) = \{w \in \{0, 1\}^* \mid t \bar{w} \rightarrow_{\beta}^* \text{true}\}$ .

Not all ELEMENTARY languages possible... but then what?

## **Theorem (Hillebrand & Kanellakis, LICS'96)**

*The languages decided by  $ST\lambda$ -terms of type  $\text{Str}[A] \rightarrow \text{Bool}$  are exactly the regular languages.*

# Regular languages in ST $\lambda$

## Theorem (Hillebrand & Kanellakis, LICS'96)

For any type  $A$  and any ST $\lambda$ -term  $t : \text{Str}[A] \rightarrow \text{Bool}$ , the language  $\mathcal{L}(t) = \{w \in \{0, 1\}^* \mid t \bar{w} \rightarrow_{\beta}^* \text{true}\}$  is regular.

### Part 1 of proof.

Fix type  $A$ . Any denotational semantics  $\llbracket - \rrbracket$  quotients words:

$$w \in \{0, 1\}^* \rightsquigarrow \bar{w} : \text{Str}[A] \rightsquigarrow \llbracket \bar{w} \rrbracket_{\text{Str}[A]} \in \llbracket \text{Str}[A] \rrbracket$$

When  $\llbracket - \rrbracket$  *non-trivial* ( $\llbracket \text{true} \rrbracket \neq \llbracket \text{false} \rrbracket$ ),  $\llbracket \bar{w} \rrbracket_{\text{Str}[A]}$  determines behavior of  $w$  w.r.t. all  $\text{Str}[A] \rightarrow \text{Bool}$  terms:

$$w \in \mathcal{L}(t) \iff t \bar{w} \rightarrow_{\beta}^* \text{true} \iff \llbracket t \bar{w} \rrbracket = \llbracket t \rrbracket(\llbracket \bar{w} \rrbracket) = \llbracket \text{true} \rrbracket$$

Goal: to decide  $\mathcal{L}(t)$ , compute  $w \mapsto \llbracket \bar{w} \rrbracket$  in some model of ST $\lambda$ .

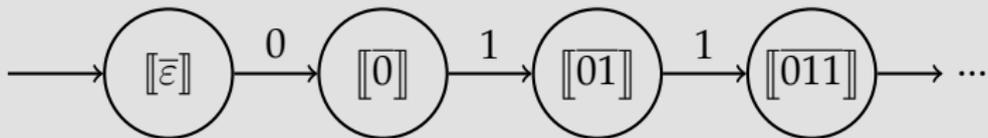
# Regular languages in $ST\lambda$

## Theorem (Hillebrand & Kanellakis, LICS'96)

For any type  $A$  and any  $ST\lambda$ -term  $t : \text{Str}[A] \rightarrow \text{Bool}$ , the language  $\mathcal{L}(t) = \{w \in \{0, 1\}^* \mid t \bar{w} \rightarrow_{\beta}^* \text{true}\}$  is regular.

### Part 2 of proof.

We use  $\llbracket - \rrbracket : ST\lambda \rightarrow \text{FinSet}$  to build a DFA with states  $Q = \llbracket \text{Str}[A] \rrbracket$ , acceptance as  $\llbracket t \rrbracket(-) = \llbracket \text{true} \rrbracket$ .



$$w \in \mathcal{L}(t) \iff \llbracket t \rrbracket \left( \llbracket \bar{w} \rrbracket_{\text{Str}[A]} \right) = \llbracket \text{true} \rrbracket \iff w \text{ accepted}$$

→ semantic evaluation argument. □



# Regular languages in ST $\lambda$

## Theorem (Hillebrand & Kanellakis, LICS'96)

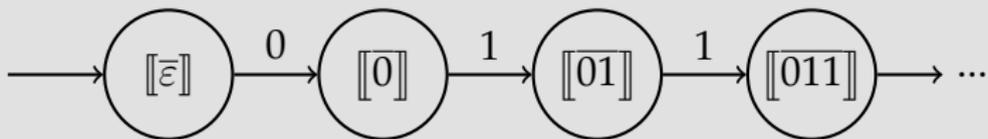
For any type  $A$  and any ST $\lambda$ -term  $t : \text{Str}[A] \rightarrow \text{Bool}$ , the language  $\mathcal{L}(t) = \{w \in \{0, 1\}^* \mid t \bar{w} \rightarrow_{\beta}^* \text{true}\}$  is regular.

### Part 2 of proof.

We use  $\llbracket - \rrbracket : \text{ST}\lambda \rightarrow \text{FinSet}$  to build a DFA with states

$Q = \llbracket \text{Str}[A] \rrbracket$ , acceptance as  $\llbracket t \rrbracket(-) = \llbracket \text{true} \rrbracket$ .

( $|Q| < \infty$ , e.g.  $2^{2^{33}}$  when  $A = \text{Bool}$ )



$$w \in \mathcal{L}(t) \iff \llbracket t \rrbracket(\llbracket \bar{w} \rrbracket_{\text{Str}[A]}) = \llbracket \text{true} \rrbracket \iff w \text{ accepted}$$

→ semantic evaluation argument. □

## Moral of the story

**Finite denotational semantics have complexity consequences.**

- Analogous results for tree automata, and for propositional linear logic (using your favorite finite model)
- Another application to  $ST\lambda$  at fixed order:

### **Theorem (Terui, RTA'12)**

*Normalizing an  $ST\lambda$ -term of type Bool w/ order  $\leq r$  subterms is*

- $k$ -EXPTIME-complete for  $r = 2k + 2$
- $k$ -EXPSPACE-complete for  $r = 2k + 3$

### **Proof of membership in $k$ -EXPTIME / $k$ -EXPSPACE.**

$\beta$ -reduce to halve order, then evaluate in LL Scott model.  $\square$

## Extensional completeness for $ST\lambda$

Need to change input representation!

Hillebrand, Kanellakis & Mairson, motivated by database queries, encode *finite relational (1st-order) structures* as inputs  
→ completeness for ELEMENTARY.

- We'll come back to this later
- “ $\beta$ -convertibility of  $ST\lambda$  terms  $\notin$  ELEMENTARY” (Statman 1979) can be recovered from this
- Refined by H&K: characterization of  $k$ -EXPTIME /  $k$ -EXPSPACE in  $ST\lambda$ +constants+equality at fixed order
  - Also using semantic evaluation for soundness!

# Regular languages in Elementary Linear Logic

---

## Elementary Linear Logic (ELL)

ELL = Multiplicative-Additive Linear Logic (MALL) + ?/! rules:

$$\frac{\vdash \Gamma, ?A, ?A}{\vdash \Gamma, ?A} \quad \frac{\vdash \Gamma}{\vdash \Gamma, ?A} \quad \frac{\vdash A_1, \dots, A_n, B}{\vdash ?A_1, \dots, ?A_n, !B}$$

!-intro: promotion and dereliction must come together.

→ enforces *stratification* by !-depth

(subproofs cannot change depth during cut-elimination)

Representable functions in 2nd-order ELL = ELEMENTARY:

- Soundness: normalization in  $f(\text{depth})$ -EXPTIME
  - depth in ELL  $\simeq$  order in  $ST\lambda$
- Extensional completeness: Church encoding works
  - thanks to (impredicative) polymorphism!

## Complexity in second-order ELL (1)

Data types:

- $\text{Bool} = 1 \oplus 1$
- $\text{Str} = \forall X. !(X \multimap X) \multimap !(X \multimap X) \multimap !(X \multimap X)$

Extensional completeness: all languages  $L \in \text{ELEMENTARY}$  expressible by ELL proofs of  $!\text{Str} \multimap !^k \text{Bool}$  ( $k$  depends on  $L$ ).

Soundness (reformulated):

proofs of  $!^k \text{Bool}$  can be normalized in  $f(k)$ -EXPTIME.

Question: what do we get for a *fixed* depth  $k$ ?

## Complexity in second-order ELL (2)

Depth  $k = 2$  case, in a variant of ELL:

### **Theorem (Baillot, APLAS'11)**

*The proofs of  $!Str \multimap !!Bool$  in 2nd order elementary affine logic with recursive types decide exactly the languages in P.*

## Complexity in second-order ELL (2)

Depth  $k = 2$  case, in a variant of ELL:

### Theorem (Baillot, APLAS'11)

*The proofs of  $!Str \multimap !!Bool$  in 2nd order elementary affine logic with recursive types decide exactly the languages in P.*

Recursive types are crucial for the above, as we show:

### Theorem

*The proofs of  $!Str \multimap !!Bool$  in 2nd order ELL decide exactly the regular languages.*

### Proof idea.

Adapt Hillebrand & Kanellakis's  $ST\lambda$  proof. Requires non-trivial *finite* semantics for 2nd order MALL (MALL2).  $\square$



# Finite semantics for MALL2

Choice of semantics: syntax/*(observational equivalence)*.

## Definition (Eqv. for propositional observations)

Let  $A$  be a MALL2 formula and  $\pi, \pi' : A$ . Define  $\pi \sim_A \pi'$  as:

$$\forall B \text{ MALL0}, \forall \rho : (A \vdash B), \mathbf{cut}(\pi, \rho) \equiv \mathbf{cut}(\pi', \rho)$$

- MALL0 = propositional MALL
- $\equiv$  is usual proof equivalence on MALL0 (think  $=_{\beta\eta}$ )

## Theorem

*For any MALL2 formula  $A$ , there are finitely many classes for  $\sim_A$ .*

## Corollary

*There exists a non-trivial finite semantics for MALL2.*

New result of independent interest, cf. Pistone's talk 2 days ago.

## Semantic evaluation in ELL, in a nutshell

Let  $\pi : !\text{Str} \multimap !!\text{Bool}$ . There exists

$$\hat{\pi} : \text{Str}[A_1] \multimap \dots \multimap \text{Str}[A_n] \multimap !\text{Bool}$$

such that  $\forall w. \pi(!\bar{w}) = !\hat{\pi}(\bar{w}[A_1], \dots, \bar{w}[A_n])$ . ( $\text{Str} = \forall X. \text{Str}[X]$ )

Thanks to stratification, w.l.o.g.  $A_1, \dots, A_n \in \text{MALL2}$ .

Using finite MALL2 semantics  $\llbracket - \rrbracket$ ,  $\bar{w}[A]$  induces map

$$\|w\|_A : \llbracket A \multimap A \rrbracket \times \llbracket A \multimap A \rrbracket \rightarrow \llbracket A \multimap A \rrbracket$$

such that  $\bar{w}[A](!f_1, !f_2) = !g \implies \|w\|_A(\llbracket f_1 \rrbracket, \llbracket f_2 \rrbracket) = \llbracket g \rrbracket$ .

- Church encoding  $\longrightarrow \|w\|_A$  computable by automaton
- $(\|w\|_{A_1}, \dots, \|w\|_{A_n})$  determine  $\hat{\pi}(\bar{w}[A_1], \dots, \bar{w}[A_n])$  and therefore  $\pi(!\bar{w})$

## What about higher depths?

We solved depth  $k = 2$  case for ELL.

(First characterization of regular languages in a type system with impredicative quantification?)

When  $k > 2$  :

### **Theorem (Baillot, APLAS'11)**

*The proofs of  $!Str \multimap !^k Bool$  in EAL+rectypes decide exactly the languages in  $(k - 2)$ -EXPTIME.*

- For ELL without recursive types, we get a class between  $(k - 3)$ -EXPTIME and  $(k - 2)$ -EXPTIME... which one exactly?
- Semantics probably has a role to play in the answer

**Inputs as finite models:  
towards logarithmic space in ELL?**

---

## A bit of descriptive complexity

Data represented as (totally ordered) *finite first-order structures* (a.k.a. *finite models*), over a signature of relation symbols.

### Example

Signature for binary strings:  $\langle \leq, S \rangle$ .

Finite models are  $(D, \leq^D, S^D)$ ,  $|D| < \infty$ .  $S^D(d) = "d^{\text{th}} \text{ bit is } 1"$ .

*Descriptive complexity*: characterize a complexity class  $\mathcal{C}$  as set of *queries* written in some logic  $L_{\mathcal{C}}$ , i.e. "is this  $L_{\mathcal{C}}$  formula true in this finite model?". For instance:

### Theorem (Fagin 1974)

*Queries in existential second-order logic* = NP.

## Finite models in ST $\lambda$ and extensional completeness

With type  $d$  of elements (equipped with  $\text{Eq} : d \rightarrow d \rightarrow \text{Bool}$ ),

- Represent  $k$ -ary relations as lists of  $k$ -tuples

$$\text{Rel}_k[d, A] = (d^k \rightarrow A \rightarrow A) \rightarrow A \rightarrow A$$

(in the spirit of database theory: relation = set of records)

- Provide list of all domain elements ( $\text{List}[d, A] = \text{Rel}_1[d, A]$ )

### **Theorem (Hillebrand, Kanellakis & Mairson, LICS'93)**

*Terms  $t : \text{List}[d, A] \rightarrow \text{Rel}_{k_1}[d, A_1] \rightarrow \dots \rightarrow \text{Rel}_{k_m}[d, A_m] \rightarrow \text{Bool}$  in ST $\lambda$  compute exactly ELEMENTARY queries over finite models.*

To feed input, instantiate  $d = o^n \rightarrow o$  ( $n = \text{domain size}$ ).

Program has “ $\forall d \exists A$ ”, input has “ $\exists d \forall A$ ”. Size of semantics depends on input, breaking earlier expressivity upper bound.

## Finite models in ELL

We transpose this idea to second-order ELL:

- We use  $\text{Rel}_{k_i}[D] = D^{\otimes k_i} \multimap \text{Bool}$ ,  
 $\text{List}[D] = \forall X. !(D \multimap X \multimap X) \multimap !(X \multimap X)$
- Allow non-linear use of  $D$ :  
 $\text{Cont}[D] = D \multimap D \otimes D, \text{Wk}[D] = D \multimap 1$

$$\text{Inp}_r = \exists D. !\text{List}[D] \otimes \bigotimes_{i=1}^n !^r \text{Rel}_{k_i}[D] \otimes !^r \text{Cont}[D] \otimes !^r \text{Wk}[D]$$

(choose  $r$  to satisfy stratification constraint)

- For size  $n$  domain, witness  $D = 1 \oplus \dots (n \text{ times}) \dots \oplus 1$   
(positive, therefore duplicable)

## Towards logarithmic space in ELL? (1)

### Theorem (Immerman 1983)

*Queries in first-order logic with deterministic transitive closure = logarithmic space (L) queries.*

### Proposition

*All L queries on finite models for a given signature can be computed by an ELL proof of  $\text{Inp}_2 \multimap \text{!Bool}$ .*

Proof idea: compute transitive closure of a relation

$\mathcal{R} \subseteq D^k \times D^k$  by iterating  $\varphi_{\mathcal{R}} : \mathcal{P}(D^k \times D^k) \rightarrow \mathcal{P}(D^k \times D^k)$ .

*Determinism of  $\mathcal{R}$  ensures linearity:  $\varphi_{\mathcal{R}} : \text{Rel}_{2k} \multimap \text{Rel}_{2k}$  in ELL.*

This is remarkable enough to hope for:

### Conjecture

*Conversely, proofs of  $\text{Inp}_2 \multimap \text{!Bool}$  only decide L queries.*



## Towards logarithmic space in ELL? (2)

### Conjecture

ELL proofs of the following type only decide  $L$  queries:

$$\left( \exists D. !\text{List}[D] \otimes \bigotimes_{i=1}^n !\text{Rel}_{k_i}[D] \otimes !\text{Cont}[D] \otimes !\text{Wk}[D] \right) \multimap !\text{Bool}$$

In predicative case ( $\forall/\exists$  range over propositional formulae):

- conjecture seems very likely
- already non-trivial... (maybe Geometry of Interaction works?)
- note that ext. completeness holds w/o impredicativity

In general case, I have no intuition or methods available 😊

## **Conclusion and future work**

---

# Conclusion

We brought methods from the  $ST\lambda$  tradition to 2nd order ELL, showing that similar phenomena occur in both:

- *Church encodings* of inputs restrict expressivity
- *Semantic evaluation* can prove this (and lots of other stuff)
- To overcome this, one can represent inputs as *finite models*

**Lemma (or Theorem, if you care about semantics)**

*The quotient of MALL2 by propositional observations is finite.*

**Theorem (or Corollary)**

*Proofs of  $!Str \multimap !!Bool$  in ELL decide regular languages.*

Moral: *geometry* (e.g. stratification) and *typing* jointly control complexity; semantics reflects the latter.

## Open problems / future work

Logspace conjecture: what kind of techniques can solve this??

Classes characterized by higher fixed depths?

(For both  $!Str \multimap !^k Bool$  and  $!np_k \multimap !^k Bool \dots$ )

Related: complexity of normalizing a proof of  $!^k Bool$  in ELL?

- $k = 0$ : P-complete
- $k = 1$ : PSPACE-hard, in EXPTIME
- $k \geq 2$ :  $(k - 1)$ -EXPTIME-hard, in  $k$ -EXPTIME

(For EAL+rectypes,  $k$ -EXPTIME-complete by Baillot's results.)

On MALL2 semantics: further investigations ongoing,  
j.w.w. P. Pistone and L. Tortora de Falco.