

**1. FINITE SEMANTICS OF POLYMORPHISM, COMPLEXITY AND THE  
POWER OF TYPE FIXPOINTS**

**j.w.w. T. Seiller, P. Pistone and L. Tortora de Falco**

**2. FROM NORMAL FUNCTORS TO LOGARITHMIC SPACE QUERIES**

**j.w.w. P. Pradic**

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LIPN, Université Paris 13

DICE-FOPARA 2019, Prague

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2. **FROM NORMAL FUNCTORS TO LOGARITHMIC SPACE QUERIES**

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A factual title for the entire thing:

“Sub-polynomial classes in (2nd-order) Elementary Linear Logic via semantic evaluation”

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## Prologue (1)

Second-order Elementary Linear Logic (ELL2):  
a programming language for elementary complexity.

### **Theorem (Girard / Danos & Joinet)**

*The languages decided by programs of type  $!Str \multimap !^k Bool$  in ELL2 are exactly the elementary recursive languages.*

- $Bool = 1 \oplus 1$
- $Str =$  “stratified” Church encoding of bitstrings
- $k$  depends on the language to be recognized

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- $k$  depends on the language to be recognized

Related questions:

- what happens if we fix  $k$  (*exponential depth*)?
- capture “reasonable” classes within ELL2?

## Prologue (2)

Depth  $k = 2$  case, in a variant of ELL2:

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

*The proofs of  $!Str \dashv\vdash !!Bool$  in 2nd-order Elementary Affine Logic with recursive types decide exactly the polynomial time languages. (More generally,  $!Str \dashv\vdash !^k Bool$  captures  $k$ -EXPTIME.)*

- “Affine” instead of “Linear”: only for simplicity
- Recursive types seem necessary...

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### **Theorem**

*The proofs of  $!Str \multimap !!Bool$  in ELL2 decide regular languages.*

A result very dependent on the use of *Church encodings*.  
New perspectives: other input representations (next episode!).

# The intervention of finite semantics

## Theorem

*The proofs of !Str  $\rightarrow$  !!Bool in ELL2 decide regular languages.*

Unlike most work on ELL, does not rely on combinatorics on proof nets... instead, apply *semantic evaluation!* As used in:

- Implicit complexity results of the 90's in the *simply typed  $\lambda$ -calculus* (ST $\lambda$ )
- Terui, RTA'12: ST $\lambda$  normalization at fixed order
- Applications to System T / PCF (cf. L. Kristiansen's work)

NB: only *monomorphic* type systems above. We will see why.

# Regular languages in the simply typed $\lambda$ -calculus

Our direct inspiration:

## 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.*

- For  $w \in \{0, 1\}^*$ ,  $w : \text{Str}[A]$  (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)
- For  $t : \text{Str}[A] \rightarrow \text{Bool}$ ,  $\mathcal{L}(t) = \{w \in \{0, 1\}^* \mid t \bar{w} \rightarrow_{\beta}^* \text{true}\}$
- Choose  $A$  depending on the language you want

(Correspondence Church encodings / finite automata;  
related: higher-order model checking)



# 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 $\lambda$ .

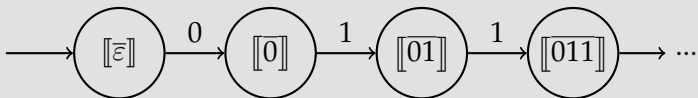
# Regular languages in $ST\lambda$

## 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  $\llbracket t \rrbracket(-) = \llbracket \text{true} \rrbracket$ .



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

□

# Regular languages in ST $\lambda$

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

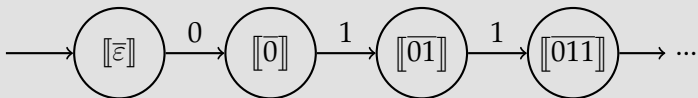
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$Q = \llbracket \text{Str}[A] \rrbracket$ , acceptance as  $\llbracket t \rrbracket(-) = \llbracket \text{true} \rrbracket$ .

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



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

For applications of semantics, finiteness is key. □

## Stating the main theorem (1)

### Theorem

The proofs of  $!Str \multimap !!Bool$  in ELL2 decide regular languages.

ELL2 = MALL2 (2nd-order Multiplicative-Additive LL)

+ restricted exponential 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:

the number of !-intro rules between a subproof and the root cannot change during cut-elimination.

(Equivalently: no dereliction and no digging,

i.e.  $!(-)$  lax monoidal functor but not comonad)

## Stating the main theorem (2)

### Theorem

*The proofs of  $!Str \multimap !!Bool$  in ELL2 decide regular languages.*

- $Bool = 1 \oplus 1$
- $Str = \forall X. !(X \multimap X) \multimap !(X \multimap X) \multimap !(X \multimap X)$
- Note that output has the minimum sensible depth:  
 $depth(!Str[A]) = 2 + depth(A) \geq 2 = depth(!!Bool)$

Extensional completeness:

instantiate Str at a type of DFA states  $A = \bigoplus_{q \in Q} 1$

Soundness: next slide, using finite semantics **for MALL2**.

## 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.**  $A_1, \dots, A_n \in \text{MALL2}$ .

(The erasure of all depth  $\geq k$  exponentials is a functor in ELL2.)

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  $\pi(!\bar{w})$

## Finite semantics for MALL2

A finite semantics of an impredicative polymorphic language seems impossible. For instance in System F:

### **Proposition**

*Any non-trivial semantics must be injective on  $\forall X. \text{Str}[X]$ .*

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### Proposition

*Any non-trivial semantics must be injective on  $\forall X. \text{Str}[X]$ .*

This example relies fundamentally on *non-linearity*.

No problem for a purely linear polymorphic language!

### Theorem

*MALL2 admits non-trivial finite semantics.*

The rest of this first talk focuses on semantics. (Sorry!)

Intuition: such semantics must be “witness-erasing” in some way; i.e. keep only the information about abstract data types ( $\exists$ ) to determine their reaction to the generic programs ( $\forall$ ) using them.



# A finite observational quotient

First attempt at finite semantics: quotient of the syntax.

## Definition (Equivalence 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  $\sim_A$ .*

Sadly, the quotient is a non-effective model in many ways:

- MALL2 provability is undecidable (Lafont 1996)
- this observational equivalence is undecidable (new)

## Girard's historical models of linear logic

Let's come back to the origins of linear logic:

- decomposition  $A \Rightarrow B \equiv !A \multimap B$  in *coherence spaces* ...

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→ the original semantics of 2nd-order (full) linear logic:  
coherence spaces and normal functors

**Claim: this semantics is finite and effective for MALL2.**

## Relational / coherent semantics: propositional case

Relational semantics:

- formula/type  $\rightsquigarrow$  set
- proof/program  $\rightsquigarrow$  subset
  - in case  $\llbracket A \multimap B \rrbracket = \llbracket A \rrbracket \times \llbracket B \rrbracket$ , subset = *relation*
- composition = relational composition

Coherence spaces refine this:

- type  $\rightsquigarrow$  undirected graph (adjacency called *coherence*)
- program  $\rightsquigarrow$  clique (pairwise coherent vertex subset)
  - notation:  $c \sqsubset X$  means “ $c$  clique of  $X$ ”
  - we still have  $|\llbracket A \multimap B \rrbracket| = |\llbracket A \rrbracket| \times |\llbracket B \rrbracket|$  ( $|\cdot|$ : vertex set)
- composition = relational composition

Forgetful functor  $\text{Coh} \rightarrow \text{Rel}$  preserves  $\otimes, \wp, \oplus, \&, (-)^\perp$ .

## Relational / coherent semantics: some examples

In both Rel and Coh, identity is

$$\text{id}_X = \{(x, x) \mid x \in X\} \subset X \times X$$

In Rel,  $A \& B = A \oplus B = A + B$ .

In Coh,  $|A \& B| = |A \oplus B| = |A| + |B|$  but

- $a \in A$  and  $b \in B$  *coherent* in  $A \& B$
- $a \in A$  and  $b \in B$  *incoherent* in  $A \oplus B$

so that

- $\text{Cliques}(A \& B) \cong \text{Cliques}(A) \times \text{Cliques}(B)$
- $\text{Cliques}(A \oplus B) \cong \text{Cliques}(A) + \text{Cliques}(B)$



## Variable types: a relational example

Let  $\pi : X \multimap X$ . For all sets  $S$ ,  $\llbracket \pi \rrbracket_{X \mapsto S} \subseteq S \times S$  in Rel.

This family should somehow be “uniform” in  $S$ , such that

uniform families  $r_S \subseteq S \times S \cong$  subsets  $r \subseteq \llbracket \forall X. X \multimap X \rrbracket$

to interpret the  $\forall$ -intro rule.

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What makes sense in all sets:  $=, \neq$ .

Represent equality by “bound variables”:  $\langle x, y, \dots \vdash t \rangle$ .

$$\{(s, s) \mid s \in S\} \leftrightarrow \{\langle x \vdash (x, x) \rangle\}$$

$$\{(s, s') \mid s \neq s' \in S\} \leftrightarrow \{\langle x, y \vdash (x, y) \rangle\}$$

$$S \times S \leftrightarrow \{\langle x \vdash (x, x) \rangle, \langle x, y \vdash (x, y) \rangle\}$$

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What makes sense in all sets:  $=, \neq$ .

“substitution of bound variables” = functoriality for injections

$$\{(s, s) \mid s \in S\} \leftrightarrow \{\langle x \vdash (x, x) \rangle\}$$

$$\{(s, s) \mid s \in S\} = \{(\iota(x), \iota(x)) \mid \iota : \{x\} \hookrightarrow S\}$$

$$\{(s, s') \mid s \neq s' \in S\} \leftrightarrow \{\langle x, y \vdash (x, y) \rangle\}$$

$$\{(s, s') \mid s \neq s' \in S\} = \{(\iota(x), \iota(y)) \mid \iota : \{x, y\} \hookrightarrow S\}$$

{expr. w/ binders}  $\cong$  {uniform families (def. next slide)}

## A relational counter-example...

### Definition (Girard's "mutilation property")

A family  $r_S \subset F(S)$  is *uniform* if for  $X \subseteq Y$ ,  $r_X = r_Y \cap F(X)$ , and similarly for injections ( $F$  functorial on injections).

Uniformity *not closed under composition* in the relational model:

- $\langle x \vdash (*, x) \rangle \leftrightarrow \{*\} \times S \subseteq \llbracket 1 \multimap X \rrbracket_{X \mapsto S}$
- $\langle x \vdash (x, *) \rangle \leftrightarrow S \times \{*\} \subseteq \llbracket X \multimap 1 \rrbracket_{X \mapsto S}$
- composition:  $\{(*, *)\}$  if  $S \neq \emptyset$ ,  $\emptyset$  if  $S = \emptyset$

## ...hence coherence spaces!

Uniformity *not closed under composition* in the relational model.  
But it works in coherence spaces; miracle due to *stability*.

### Definition (Girard's "mutilation property")

A family  $r_S \sqsubseteq F(S)$  is *uniform* if for  $X \subseteq Y$ ,  $r_X = r_Y \cap |F(X)|$ ,  
and similarly for embeddings ( $F$  functorial on embeddings).

where  $X \subseteq Y$  means "X induced subgraph of Y".

Composition issue part of the folklore.

- Subtlety overlooked by Girard
- Can be proved for coherence spaces via "Moggi's trick" (mentioned in *Proofs and Types* appendix for another purpose!)
- In relational model: investigated by A. Bac, T. Ehrhard and C. Tasson

## Variable types in coherence spaces

So types with  $n$  parameters  $\rightsquigarrow$  functors  $\text{Cohl}^n \rightarrow \text{Cohl}$  where

- objects of  $\text{Cohl}$ : coherence spaces
- morphisms  $X \hookrightarrow Y$  in  $\text{Cohl}$ : embeddings  
(i.e. graph isomorphism between  $X$  and induced subgraph of  $Y$ )

Note that  $X \subseteq Y \Rightarrow X^\perp \subseteq Y^\perp$  ( $X^\perp =$  complement graph of  $X$ ),  
hence *covariance* (cf. previous example  $X^\perp \not\cong X$ ).

And proofs  $\rightsquigarrow$  uniform families. To interpret  $\forall$ , we want

$$\text{uniform families } c_X \sqsubset F(X) \cong \text{cliques } c \sqsubset \text{Tr}(F)$$

$\rightarrow$  for this, Girard requires  $F$  to be a *normal functor*  
( $\simeq$  categorification of stable functions)

# Normal functors

## Definition

A functor  $F : \mathbf{Cohl} \rightarrow \mathbf{Cohl}$  is *normal* if it preserves  
(1) pullbacks and (2) filtered colimits.

## Theorem (Girard's normal form theorem)

If  $x \in |F(X)|$  then  $\exists! X_0 \subseteq X$  finite minimal s.t.  $x \in |F(X_0)|$ .

(More precisely: should replace inclusion by embedding in statement; categorically, initiality in a slice cat. of a cat. of elements)

- $\exists$  minimal  $X_0$  ensured by (1) (cf. *polynomial functors*)
- finiteness ensured by (2) (normal f. = *finitary* polynomial f.)

Set of *normal forms* (morally,  $X_0 = (\text{fv}(x), \text{coherence})$ ):

$$\text{NF}(F) = \{ \langle X_0 \vdash x \rangle \mid x \in F(X_0) \text{ with } X_0 \text{ minimal} \}$$

# Traces of normal functors

Representation of  $\forall$ :

- define a non-reflexive coherence relation on  $\text{NF}(F)$
- def.  $|\text{Tr}(F)| = \{ \langle X_0 \vdash x \rangle \in \text{NF}(F) \mid \langle X_0 \vdash x \rangle \text{ self-coherent} \}$
- restrict coherence on  $\text{NF}(F)$  to  $|\text{Tr}(F)|$   
→ makes  $\text{Tr}(F)$  a coherence space
- its cliques are in bijection with uniform families for  $F$

Revisiting previous examples:

- $\llbracket \forall X. X \multimap X \rrbracket = \{ \langle x \vdash (x, x) \rangle \} \cong \llbracket 1 \rrbracket$   
only 1 self-coherent point
- $\llbracket \forall X. 1 \multimap X \rrbracket = \llbracket \forall X. X \multimap 1 \rrbracket = \emptyset$   
thus no problem with composition here!



## Normal functors of finite degree

New: for our purposes, we consider *finite* normal functors, i.e.:

- preserving finiteness:  $\text{Card}(X) < \infty \implies \text{Card}(F(X)) < \infty$
- of *finite degree*:  $\text{deg}(F) = \sup_{\langle X_0 \vdash x \rangle \in \text{NF}(F)} \text{Card}(X_0) < \infty$

(Mutatis mutandis for open types with  $n$  variables.)

Intuition:  $\text{deg}(F)$  = max number of bound variables used

$$\text{deg}(F^\perp) = \text{deg}(F) \quad \text{deg}(X \mapsto \text{Tr}(F(X, -))) \leq \text{deg}(F)$$

$$\text{deg}(F \otimes G) = \text{deg}(F) + \text{deg}(G) \quad \text{deg}(F \oplus G) = \max(\text{deg}(F), \text{deg}(G))$$

Also,  $\text{Card}(\text{Tr}(F(X, -)))$  bounded using  $\text{deg}(F)$ .

### Theorem

*Coherence spaces and finite normal functors provide a finite semantics of MALL2.*

## Summary of the first episode

- !Str  $\rightarrow$  !!Bool in ELL2 captures
  - polynomial time with recursive types (Baillot 2011)
  - **regular languages** without them
- Proof by semantic evaluation, using stratification + finite semantics for MALL2
- The historical coherence space model is finite for MALL2
  - categorical formalism  $\rightarrow$  syntactic presentation

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Next:

- Replace Str with alternative input representation  
 $\rightarrow$  get larger sub-polynomial complexity class
- Apply size bounds and effectivity of coherence spaces

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A factual title for the entire thing:

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## Recap of the previous episode...

Previously:

methods for ICC in simply-typed  $\lambda$ -calculus ( $ST\lambda$ )

transposed to second-order Elementary Linear Logic (ELL2),

thanks to finite semantics for MALL2.

### **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.*

### **Theorem**

*The proofs of  $! \text{Str} \multimap !! \text{Bool}$  in ELL2 decide regular languages.*

Both use *Church encodings*, proofs by *semantic evaluation*.

## The return of Hillebrand & Kanellakis

Idea: *change input representation* to overcome expressivity limit.

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*The criticism of TLC expressibility is unjustified, and a theme of this paper is to quantify how rich a framework TLC is for expressing computations, provided that the right setting is chosen.*

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*The criticism of TLC expressibility is unjustified, and a theme of this paper is to quantify how rich a framework TLC is for expressing computations, provided that the right setting is chosen.*

in *Database Query Languages Embedded in the Typed Lambda Calculus*, Hillebrand, Kanellakis & Mairson, 1996



# Database queries?

Relational database = *finite relational (1st-order) structure*

a.k.a. *finite model* (relation = set of records (tuples) = table)

→ connections w/ finite model theory / descriptive complexity

## Example

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

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

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

*With the right choice of encoding, the queries over finite models in  $ST\lambda$  are exactly the elementary recursive queries.*

(Quote in previous slide from journal version in *Information and Computation*)

→ just like ELL2,  $ST\lambda$  is a “calculus of elementary complexity”

(Remark: both embed in Linear Logic by Levels)

## What this talk is about

We define a type  $\text{Inp}$  of inputs as finite models in ELL2.

Queries computed by proofs of  $\text{Inp} \multimap \text{!}!\text{Bool}$  should:

- go beyond regular languages
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What we obtain – unexpectedly – is *logarithmic space*:

- lower bound: all  $\text{L}$  queries expressible
- upper bound:  $\text{NL}$
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Another precursor (Gurevich, FOCS'83):

$\text{L} =$  primitive recursion over finite models

## Finite models in ELL

Let's encode a finite model of domain size  $n$ .

- Type of domain elements:  $D = 1 \oplus \dots (n \text{ times}) \dots \oplus 1$
- Domain iterator:  $\text{List}[D] = \forall X. !(D \multimap X \multimap X) \multimap !(X \multimap X)$
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- Package this in an *existential type* (a.k.a. abstract data type)

$$\text{Inp} = \exists D. !\text{List}[D] \otimes \bigotimes_{i=1}^m !!\text{Rel}_{k_i}[D]$$

for signature w/ relation symbols of arities  $k_1, \dots, k_m$   
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- Interface needs to allow non-linear use of  $D$ :  
 $\text{Cont}[D] = D \multimap D \otimes D, \text{Wk}[D] = D \multimap 1$

## Lower bound via descriptive complexity (1)

*Descriptive complexity* considers queries defined by formulas in extensions of 1st-order logic, to capture complexity classes.

### **Theorem (Immerman 1983)**

$\mathbb{L} = \text{queries in 1st-order logic} + \text{deterministic transitive closure.}$

$\phi, \psi, \dots ::= \mathcal{R}_i(x_1, \dots, x_{r_i}) \mid \neg\phi \mid \phi \vee \psi \mid \exists x.\phi \mid \text{DTC}_{\vec{x}, \vec{y}}(\phi)$   
( $\mathcal{R}_i$ : relation in signature;  $x$ : variable for domain element)

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For  $R \subseteq D^k \times D^k$  ( $D$ : domain):

- $R_d = \{(x, y) \in R \mid \forall z \neq y, (x, z) \notin R\}$ 
  - graph of *partial function*  $f_R : D^k \rightarrow D^k$
- $\text{DTC}(R) = R_d^*$  (reflexive transitive closure of  $R_d$ )
  - $(x, y) \in \text{DTC}(R) \iff \exists n : y = (f_R)^n(x)$

Note: general TC ( $R \mapsto R^*$  instead of  $R_d^*$ ) corresponds to NL.

## Lower bound via descriptive complexity (2)

How to compute transitive closure in ELL2?

$$\psi_R : Q \mapsto \{(x, z) \mid x = z \vee (\exists y : (x, y) \in R \wedge (y, z) \in Q)\}$$

$R^*$  = least fixpoint of  $\psi_R$ , obtained by iteration ( $\psi_R$  monotone).

Problem: List[ $D$ ] can only iterate *linear* maps, because of ELL stratification, and  $\psi_R$  is non-linear (because of  $\exists y$ ).

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For DTC, we have:  $\psi_{R_d} : Q \mapsto \{(x, z) \mid x = z \vee (f_R(x), z) \in Q\}$   
which can be expressed as a linear map  $\text{Rel}_{2k}[D] \multimap \text{Rel}_{2k}[D]$ .

*Determinism* (L vs NL) corresponds to *linearity*.

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*Determinism* ( $\mathbb{L}$  vs  $\text{NL}$ ) corresponds to *linearity*. In the end:

### Theorem

*All  $\mathbb{L}$  queries can be computed by an ELL2 proof of  $\text{Inp} \multimap \text{!Bool}$ .*

Alternative proof for inputs as strings: two-way multihead automata

## Towards the upper bound

When using Church-encoded input:

- a proof  $\pi : !\text{Str} \multimap !!\text{Bool}$  comes from some proof  $\hat{\pi} : \text{Str}[A_1] \multimap \dots \multimap \text{Str}[A_k] \multimap \text{Bool}$
- main computational engine: iterating over the string using  $\text{Str}[A_i]$ ; accumulator type  $A_i \in \text{MALL2}$ .
- $A_i$  is known in advance and has a finite semantics  $\llbracket A_i \rrbracket$   
 $\rightarrow$  iteration can be performed by a finite automaton.

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→ iteration can be performed by a finite automaton.

With finite models as inputs:

- Recall that  $\text{Inp} = \exists D. !\text{List}[D] \otimes !!B_1 \otimes \dots \otimes !!B_l, B_i \in \text{MALL2}$
- main computational engine: iterating over domain elements using  $\text{List}[D][A_i]$ ; accumulator type  $A_i \in \text{MALL2}$
- thanks to  $\exists D, A_i$  (and thus  $\text{Card}(\llbracket A_i \rrbracket)$ ) depends on  $D$ 
  - expressivity comes from *existential* input type



# Coherence spaces and normal functors: bounds and complexity

Previous episode: coherence spaces and normal functors of *finite degree* provide a finite semantics for MALL2.

## Theorem (finite degree = polynomial growth)

Let  $F : \text{Cohl} \rightarrow \text{Cohl}$  be a normal functor. There exists  $d \in \mathbb{N}$  s.t.  
 $\text{Card}(|F(X)|) = O(\text{Card}(|X|^d))$  if and only if  $F$  is a finite n.f.  
In that case,  $\text{deg } F$  is the smallest such  $d$ .

Complexity properties (thanks to syntactic presentation):

- Given fixed  $F$ ,  $X \mapsto F(X)$  computable in  $\mathbb{L}$  (logspace)
- Given fixed  $c \sqsubset \text{Tr}(F)$ ,  $X \mapsto c_X \sqsubset F(X)$  computable in  $\mathbb{L}$

—→ hope: perform semantic evaluation in coherence spaces

(In fact the semantics is *effective*:

$A \mapsto \llbracket A \rrbracket$  and  $(\pi : A) \mapsto \llbracket \pi \rrbracket \sqsubset \llbracket A \rrbracket$  are computable.)

## Upper bound by semantic evaluation

Bottleneck for evaluation in coherence spaces: iterations

$\llbracket D \multimap A_i \multimap A_i \rrbracket \rightarrow \llbracket A_i \multimap A_i \rrbracket$  corresponding to  $\text{List}[D][A_i]$ .

Thanks to  $\exists D, A_i$  (and thus  $\text{Card}(\llbracket A_i \rrbracket)$ ) depends on  $D$ .

$\text{Card}(\llbracket A_i \rrbracket) = \text{poly}(\text{Card}(D))$ , and instantiation complexity is  $L$ .

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So these iterations  $L$ -reduce to the *Iterated composition problem*:

given a coherence space  $A$  and cliques  $f_1, \dots, f_n \sqsubset A \multimap A$ ,  
compute composition  $(f_1 \circ \dots \circ f_n) \sqsubset A \multimap A$

Naive goal: solve this in  $L$

→ evaluate  $\text{List}[D][A_i]$  iterations

→ get  $L$  soundness for our ELL2 queries

Note: Previous space bounds for variants of LL used *Geometry of Interaction*. Not possible here (additives/quantifiers).

## Complexity of iterated composition

*Iterated composition problem:*

given a coherence space  $A$  and cliques  $f_1, \dots, f_n \sqsubset A \multimap A$ ,  
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- Iterated composition of general relations is NL-complete  
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→ NL bound on our ELL2 queries

- Stability property in coherence spaces:

$\forall (x, y) \in (f_1 \circ \dots \circ f_n), \exists! (x = x_0, x_1, \dots, x_n = y) : (x_{i-1}, x_i) \in f_i$   
*uniqueness* of  $x_i$  translates to *unambiguous* nondeterminism:

for each input, at most 1 accepting run

→ iterated composition in UL, ELL2 queries in  $L^{UL}$

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→ iterated composition in UL, ELL2 queries in  $L^{UL}$
- Possible in L for coherence spaces?  
Don't know, seems very hard, possibly false.  
Idea: sidestep the issue by *fixed-parameter complexity*.  
Not yet working in general case.

## Some ideas from game semantics (1)

Idea:  $A[D/X]$  should be a “game” with  $O(1)$  depth and  $\text{poly}(\text{Card}(D))$  branching ( $A$  fixed,  $D$  varying).

To evaluate ELL2 queries, iterated composition in  $L$  at (arbitrary) fixed depth suffices.

Proof of concept for now, carried out in coherence spaces: games of depth 3.

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Proof of concept for now, carried out in coherence spaces: games of depth 3. Enough room for extensional completeness!

### Theorem

*The  $\mathbb{L}$  queries are exactly those expressible as proofs of  $\text{Inp} \multimap \text{!!Bool}$  in ELL2 with  $\exists$ -intro restricted to types of the form  $P \otimes (Q \multimap R)$ , where  $P, Q$  and  $R$  are positive quantifier-free types.*

Typically:  $\text{Rel}_k[D] = 1 \otimes (D^k \multimap 1 \oplus 1)$ ,

becomes depth 2 game when  $D$  instantiated to  $1 \oplus \dots \oplus 1$ .



## Some ideas from game semantics (2)

Write  $[n] = 1 \oplus \dots \oplus 1$ . Depth 2 games:  $[p] \multimap [q] = \bigotimes_{i=1}^p \bigoplus_{j=1}^q 1$ .

Typically:  $\text{Rel}_k[D] = 1 \otimes (D^k \multimap 1 \oplus 1) = [n^k] \multimap [2]$  when  $D = [n]$   
opponent plays  $\{1, \dots, n^k\}$  / player answers true/false

Iterated composition of  $f_1, \dots, f_n : ([p] \multimap [q]) \multimap ([p] \multimap [q])$ :

- first propagate  $[p]$  backwards (negative polarity)
- then propagate  $[q]$  forwards (positive polarity)

From our ELL2 encoding of deterministic transitive closure, recover naive procedure.

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Depth 3 ( $[m] \otimes ([p] \multimap [q])$ ): starts getting more tricky

Depth  $\geq 4$ : unsolved for now (but soon!)

## Summary of second episode

### Conjecture

*Queries defined by ELL2 proofs of  $\text{Inp} \dashv\vdash \text{!!Bool}$  compute L queries.*

- A functional language for space-bounded database queries
- First characterization of sub-polynomial class in a language with impredicative polymorphism

Results for now:

- Extensional completeness via descriptive complexity
- NL upper bound w/ coherence spaces + normal functors
  - Novelty: space bound in LL without GoI
- Algorithm with game-semantical flavor
  - Proves L upper bound for restricted case

Towards soundness in general case: hypercoherences as games?