# Implicit automata in typed $\lambda$ -calculi

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There is a remarkable divide in the field of logic in Computer Science, between two distinct strands: one focusing on semantics and compositionality ("Structure"), the other on expressiveness and complexity ("Power"). It is remarkable because these two fundamental aspects of our field are studied using almost disjoint technical languages and methods, by almost disjoint research communities.

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- The Scalp community cares about "structure"
- This talk: connections with automata, from the "power" side
  - Are they really though? I'll come back to that at the end

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#### Theorem (Schwichtenberg 1975)

The functions  $\mathbb{N}^k \to \mathbb{N}$  definable by simply-typed  $\lambda$ -terms  $t : \mathsf{Nat} \to \cdots \to \mathsf{Nat} \to \mathsf{Nat}$ are the extended polynomials (generated by 0, 1, +, ×, id and ifzero).

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But some open questions have no known satisfying answer...

### Simply typed functions on Church numerals (1)

Recall that the type of Church numerals is  $Nat = (o \rightarrow o) \rightarrow o \rightarrow o$ 

$$n \in \mathbb{N} \quad \rightsquigarrow \quad \overline{n} = \lambda f. \ \lambda x. \ f(\dots \ (f \ x) \dots) : \text{Nat with } n \text{ times } f$$

All inhabitants of Nat are equal to some  $\overline{n}$  up to  $=_{\beta\eta}$ 

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Let's add a bit of (meta-level) polymorphism: for  $n \in \mathbb{N}$ ,

$$\overline{n}:\mathsf{Nat}[A]=\mathsf{Nat}[A/o]=(A\to A)\to A\to A$$

#### **Open question**

Choose some simple type *A* and some term  $t : Nat[A] \rightarrow Nat$ . What functions  $\mathbb{N} \rightarrow \mathbb{N}$  can be defined this way?

## Simply typed functions on Church numerals (2)

#### **Open question**

Choose some simple type *A* and some term  $t : Nat[A] \to Nat$ . What functions  $\mathbb{N} \to \mathbb{N}$  can be defined this way? (where  $B[A] = B\{o := A\}$ )

Why is nobody working on this seemingly natural question?

- Apparently, low hopes for a nice answer until now
  - you can express towers of exponentials
  - but not subtraction or equality (Statman 198X)
- Not so important: this is about "power" while our focus is on "structure"

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Little-known(?) fact: the case  $\mathbb{N} \to \{0,1\} / Nat[A] \to Bool has a very satisfying characterization, that even generalizes to strings!$ 

#### Church encodings of binary strings [Böhm & Berarducci 1985]

 $\simeq$  fold\_right on a list of characters (generalizable to any alphabet; Nat = Str\_{\{1\}}):

$$\overline{\texttt{011}} = \lambda f_0. \ \lambda f_1. \ \lambda x. \ f_0 \ (f_1 \ (f_1 \ x)): \mathsf{Str}_{\{\texttt{0},\texttt{1}\}} = (o \to o) \to (o \to o) \to o \to o$$

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Simply typed  $\lambda$ -terms  $t : \operatorname{Str}_{\{0,1\}}[A] \to \operatorname{Bool} \operatorname{define} \operatorname{languages} L \subseteq \{0,1\}^*$ Example:  $t = \lambda s. s$  id not true :  $\operatorname{Str}_{\{0,1\}}[\operatorname{Bool}] \to \operatorname{Bool}$  (even number of 1s)

 $t \overline{011} \longrightarrow_{\beta} \overline{011} \text{ id not true} \longrightarrow_{\beta} \text{ id (not (not true))} \longrightarrow_{\beta} \text{true}$ 

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#### Theorem (Hillebrand & Kanellakis 1996)

All regular languages, and only those, can be defined this way.

## Regular languages in ST $\lambda$ C and implicit complexity

#### Template for theorems at the structure/power interface

The languages/functions computed by programs of type *T* in the programming language  $\mathcal{P}$  are exactly those in the class  $\mathcal{C}$ .

- Hillebrand & Kanellakis:  $\mathcal{P} = \text{simply typed } \lambda \text{-calculus}, \mathcal{C} = \text{regular languages}$ 
  - Good news: unlike "extended polynomials", a central object in another field of computer science, namely *automata theory*
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- Implicit computational complexity: C is a complexity class e.g. P, NP, ...
  - ICC has been an active research field since the 1990s (cf. Péchoux's HDR)
  - Historical example (Girard): P = Light Linear Logic, C = P (polynomial time)

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#### Our "implicit automata" research programme: $\mathcal C$ coming from automata theory

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"Implicit automata" challenge: find *natural* characterizations for other automata-theoretic classes of languages/functions using typed  $\lambda$ -calculi

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Next: we review regular languages and star-free languages, our new target

### **Regular languages**

Many classical equivalent definitions (+  $ST\lambda C$  with Church encodings!):

- *regular expressions*: 0\*(10\*10\*)\* = "only 0s and 1s & even number of 1s"
- *finite automata* (DFA/NFA): e.g. drawing below



### **Regular languages**

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- *finite automata* (DFA/NFA)
- *algebraic* definition below (very close to DFA), e.g.  $M = \mathbb{Z}/(2)$

#### Theorem (classical)

A language  $L \subseteq \Sigma^*$  is regular  $\iff$  there are a monoid morphism  $\varphi : \Sigma^* \to M$  to a finite monoid M and a subset  $P \subseteq M$  such that  $L = \varphi^{-1}(P) = \{w \in \Sigma^* \mid \varphi(w) \in P\}.$ 

Σ: finite alphabet, Σ\*: words over Σ monoid structure: for  $v, w ∈ Σ^*$ , v · w = concatenation morphism: for  $w ∈ Σ^*$  with *n* letters, φ(w) = φ(w[0]) ... φ(w[n])

### Star-free languages and aperiodicity

Star-free languages: regular expressions with complementation but without star

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L, L' ::= \varnothing \mid \{a\} \mid L \cdot L' \mid L \cup L' \mid L^{\mathsf{c}}
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#### Definition

A (finite) monoid *M* is *aperiodic* when  $\forall x \in M, \exists n \in \mathbb{N} : x^n = x^{n+1}$ .

Morally,  $(aa)^*$  involves the group  $\mathbb{Z}/(2)$ : not aperiodic

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How to enforce aperiodicity in a  $\lambda$ -calculus? Consider monoids of terms  $t : A \to A$ Embedding of non-aperiodic  $\mathbb{Z}/(2)$  via not : Bool  $\rightarrow$  Bool (not  $\circ$  not  $=_{\beta}$  id)

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oops, now there's a *y* occuring before an *x*...

### Non-commutative types and linear logic

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- recently: correspondence with planar combinatorial maps (N. Zeilberger)
- $\longrightarrow$  not contrived to get a connection with automata!

## Finally, our theorem

Our type system: a base type o + two function arrows that coexist non-commutative affine:  $\lambda^{\circ}x$ .  $t : A \multimap B$  unrestricted:  $\lambda^{\rightarrow}x$ .  $t : A \to B$ 

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### Theorem (N. & Pradic, ICALP 2020)

This typed  $\lambda$ -calculus can define all star-free languages, and only those, with terms of type  $Str_{\{0,1\}}[A] \longrightarrow$  Bool where A is purely affine *i.e.* does not contain any ' $\rightarrow$ '. (A may vary depending on the language, as in Hillebrand & Kanellakis.)

With commutative affine types, you'd get regular languages.

Typing judgments  $\Gamma \mid \Delta \vdash t : A$  for a *set*  $\Gamma$  and an **<u>ordered list</u>**  $\Delta$ 

$$\frac{\Gamma \uplus \{x:A\} \mid \varnothing \vdash x:A}{\Gamma \vDash \{x:A\} \mid \bigtriangleup \vdash x:A} \qquad \frac{\Gamma \mid \bigtriangleup \vdash x:A \to B \qquad \Gamma \mid \varnothing \vdash u:A}{\Gamma \mid \bigtriangleup \vdash t:B}$$

$$\frac{\Gamma \uplus \{x:A\} \mid \bigtriangleup \vdash t:B}{\Gamma \mid \bigtriangleup \vdash \lambda^{+}x.t:A \to B} \qquad \frac{\Gamma \mid \bigtriangleup \vdash t:A \to B \qquad \Gamma \mid \bigtriangleup \vdash u:B}{\Gamma \mid \bigtriangleup \vdash \lambda^{-}x.t:A \to B}$$

$$\frac{\Gamma \mid \bigtriangleup \vdash x:A \to B}{\Gamma \mid \bigtriangleup \vdash \lambda^{-}x.t:A \to B} \qquad \frac{\Gamma \mid \bigtriangleup \vdash t:A \to B \qquad \Gamma \mid \bigtriangleup' \vdash u:A}{\Gamma \mid \bigtriangleup \vdash t:B}$$

$$\frac{\Gamma \mid \bigtriangleup \vdash x:A \to B}{\Gamma \mid \bigtriangleup \vdash \chi \land \Box} \qquad \frac{\Gamma \mid \bigtriangleup \vdash t:A}{\Gamma \mid \bigtriangleup' \vdash t:A} \text{ when } \Delta \text{ is a } \underline{\text{subsequence of }} \Delta'$$

without weakening (last rule)  $\approx$  Polakow & Pfenning's Intuitionistic Non-Commutative Linear Logic

To prove  $\lambda$ -definable  $\subseteq$  star-free, we use:

Lemma (in our non-commutative  $\lambda$ -calculus)

*For any purely affine A, the monoid*  $\{t \mid t : A \multimap A\} / =_{\beta\eta} is$  finite and aperiodic.

Finite due to affineness, aperiodic due to non-commutativity.

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### Theorem (Krohn & Rhodes 1965 (special case))

Any finite and aperiodic monoid can be "decomposed" as a wreath product of "building blocks" which are certain monoids with 3 elements.

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*For any purely affine A, the monoid*  $\{t \mid t : A \multimap A\} / =_{\beta\eta} is$  finite and aperiodic.

Finite due to affineness, aperiodic due to non-commutativity.

The converse is harder (unusual for implicit complexity!): how do we exploit the aperiodicity assumption? Using the powerful toolbox of finite semigroup theory

### Theorem (Krohn & Rhodes 1965 (special case))

Any finite and aperiodic monoid can be "decomposed" as a wreath product of "building blocks" which are certain monoids with 3 elements.

To avoid the scary algebra: a detour through *transducers*, i.e. automata with output.





 $abba \mapsto$ 



 $abba \mapsto a$ 



 $abba \mapsto aa$ 



 $abba \mapsto aabb$ 



 $abba \mapsto aabbbb$ 



 $abba \mapsto aabbbbab$ 



 $abba\mapsto aabbbbab$ 

Note: there is an implicit characterization of sequential transductions using *cyclic proofs* [DeYoung & Pfenning, APLAS'16]; Anupam and Gianluca's talks later today will show other results on ICC with cyclic proofs





### Transition for *a*: \_ $\mapsto$ *q*<sub>*a*</sub>



Transition for *a*:  $\_ \mapsto q_a$ 

Transition for *b*:  $\_ \mapsto q_b$ 



Transition for *a*: \_  $\mapsto$  *q*<sub>a</sub> Transition for *b*: \_  $\mapsto$  *q*<sub>b</sub> They generate the *transition monoid* {id, (\_  $\mapsto$  *q*<sub>a</sub>), (\_  $\mapsto$  *q*<sub>b</sub>)} (Remark: this 3-element monoid is the building block in Krohn–Rhodes!) This monoid is aperiodic  $\rightarrow$  *aperiodic sequential transducer* 



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#### Lemma

$$L \subseteq \Sigma^*$$
 star-free  $\iff L = f^{-1}(\varepsilon)$  for some aperiodic sequential  $f : \Sigma^* \to \Gamma^*$ 

# The Krohn–Rhodes decomposition, again

### **Reformulation of the Krohn–Rhodes decomposition**

Aperiodic sequential functions are generated from aper. seq. transducers *with 2 states* (as in prev. slide) by usual function composition.

So it's enough to find  $\lambda$ -terms for transducers with 2 states. (Not-so-trivial programming exercise!)

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#### Theorem

*Our non-commutative affine*  $\lambda$ *-calculus can define all aperiodic sequential functions with terms of type*  $\operatorname{Str}_{\Gamma}[A] \longrightarrow \operatorname{Str}_{\Sigma}(A \text{ purely affine}).$ 

### Corollary

*It can define all star-free languages with terms of type*  $Str_{\Sigma}[A] \multimap Bool$ *.* 

# **String-to-string functions**

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*Our non-commutative*  $\lambda$ *-calculus can define all aperiodic sequential functions with terms*  $t : \operatorname{Str}_{\Gamma}[A] \multimap \operatorname{Str}_{\Sigma}[o]$  (A purely affine).

Obtained as byproduct of our proof. What about the converse?

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- Exact characterization of  $Str_{\Gamma}[A] \longrightarrow Str_{\Sigma}$  (*A* purely affine)?
- What happens in a commutative affine  $\lambda$ -calculus?

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- What happens in a commutative affine  $\lambda$ -calculus?

Similar to questions at the beginning about simply typed  $\lambda$ -calculus, but affineness makes things easier.

# **Characterizing regular functions**

#### Theorem (commutative case)

 $f: \Gamma^* \to \Sigma^*$  can be expressed by an affine  $\lambda$ -term  $t: \operatorname{Str}_{\Gamma}[A] \multimap \operatorname{Str}_{\Sigma}(A \text{ purely affine}) \iff f \text{ is a regular function.}$ 

Regular functions admit many equivalent definitions; among others:

- monadic second-order logic (reg. fn. also called "MSO transductions")
- basic functions + combinators (several variants)
- copyless streaming string transducers
- *two-way* finite state transducers

Non-commutative case: *aperiodic regular functions* ("first-order transductions")

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- **copyless** streaming string transducers  $\simeq$  affine types!
- *two-way* finite state transducers, closely related to the *geometry of interaction* semantics of linear logic [Hines 2003]

Non-commutative case: *aperiodic regular functions* ("first-order transductions")

# **Decomposition of regular functions**

### One possible proof regular function $\implies$ affine $\lambda$ -definable uses:

Theorem (Bojańczyk et al. (see e.g. [Bojańczyk & Stefański 2020]))

Any regular function can be obtained as a composition of:

- sequential functions (that can themselves be decomposed by Krohn–Rhodes);
- $mapReverse_{\Sigma}, mapDuplicate_{\Sigma} : (\Sigma \cup \{\#\})^* \rightarrow (\Sigma \cup \{\#\})^*$  for  $\# \notin \Sigma$

For  $w_1, \ldots, w_n \in \Sigma^*$ , mapReverse $_{\Sigma}(w_1 \# \ldots \# w_n) = \operatorname{rev}(w_1) \# \cdots \# \operatorname{rev}(w_n)$ mapDuplicate $_{\Sigma}(w_1 \# \ldots \# w_n) = w_1 w_1 \# \cdots \# w_n w_n$ 

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Such factorization theorems (the above and Krohn–Rhodes) are a form of compositional (algebraic?) "structure" arising in the study of "power"! This often happens in automata theory...

Next: a technique to bound the expressive power of  $\lambda$ -terms.

Example: for any type A & any simply typed  $\lambda$ -term t: Str $_{\{0,1\}}[A] \to$  Bool, the language  $\{w \in \{0,1\}^* \mid t \overline{w} =_{\beta} true\}$  is *regular* [Hillebrand & Kanellakis 1996].

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### Proof sketch: by semantic evaluation.

Use the standard semantics in *finite sets*:  $[A \to B] = [B]^{[A]}$ .

 $\llbracket \overline{w} \rrbracket$  determines whether  $\llbracket t \overline{w} \rrbracket = \llbracket t \rrbracket (\llbracket \overline{w} \rrbracket) = \llbracket t rue \rrbracket$ . When  $Card(\llbracket o \rrbracket) \ge 2$ ,  $\llbracket true \rrbracket \neq \llbracket false \rrbracket$ , so this means  $t \overline{w} =_{\beta} true$ .

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[[Str[A]]] is finite and has a monoid structure ( $[[concat]], [[\overline{\varepsilon}]]$ ) such that  $w \in \{0, 1\}^* \to [[\overline{w}]] \in [[Str[A]]]$  is a monoid morphism.

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Similar ideas in higher-order model checking, e.g. Grellois & Melliès
# Categorical automata theory meets semantic evaluation

Semantic evaluation strategy for affine  $\lambda$ -definable  $\implies$  regular function:

- Consider a *category* C of "transducer behaviors", such that *automata over* C (in the sense of [Colcombet & Petrişan 2017]) compute regular functions
  - C = Int(PFinSet) (geometry of interaction): two-way transducers
  - *C* = "Dialectica-like" category of affine register assignments: variant of copyless streaming string transducers
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Side benefits: some composition and determinization theorems for transducers "secretly rely on" monoidal closed categories, leading to generalizations

 Comparison-free polyregular functions [N., Noûs, Pradic ICALP'21]: discovered by playing around with Str[A] → Str instead of Str[A] → Str natural from an automata-theoretic POV, part of a recent line of investigations into polynomial growth transductions (Bojańczyk, Douéneau, Kiefer, Lhote, ...)

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Also: tree automata vs multiplicative/additive distinction in linear logic

# By way of conclusion: back to Structure meets Power

There is a remarkable divide in the field of logic in Computer Science, between two distinct strands: one focusing on semantics and compositionality ("Structure"), the other on expressiveness and complexity ("Power"). It is remarkable because these two fundamental aspects of our field are studied using almost disjoint technical languages and methods, by almost disjoint research communities.

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Thanks for your attention! Questions?