## Automata minimization

a lightweight categorical approach

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## Overview

- Motivation: hybrid set-vector automata
- Byproduct: a lightweight category-theoretic approach
- Automata are functors! Minimization in this setting.
- Examples
- Open problems!

# Motivation

#### Once upon a time weighted automata were introduced by



- [M.-P. Schützenberger, 1961]
   On the definition of a family of automata
- A minimization algorithm is also provided.

An vector automaton is a tuple

 $\mathcal{A} = \langle Q, q_0, f, (\delta_a)_{a \in A} \rangle$ 

- Q is an  $\mathbb{R}$ -vector space
- $q_0$  is an initial vector in Q
- $f: Q \rightarrow \mathbb{R}$  associates to each state an output value
- for each  $a \in A$ ,  $\delta_a: Q \to Q$  is a linear map

The language accepted by  $\mathcal{A}$  is a map  $L_{\mathcal{A}}: \mathcal{A}^* \to \mathbb{R}$  defined by

$$w \in A^* \mapsto f(\delta_w(q_0))$$

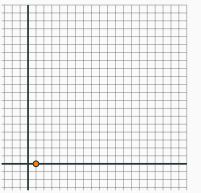
Consider the alphabet  $A = \{a, b, c\}$  and the language  $L: A^* \to \mathbb{R}$ 

$$L(u) = \begin{cases} 2^{|u|_a} & \text{if } |u|_b \text{ is even and } |u|_c = 0, \\ 0 & \text{otherwise} \end{cases}$$

An automaton accepting this language is

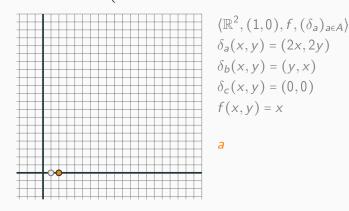
 $\langle \mathbb{R}^2, (1,0), f, (\delta_a)_{a \in A} \rangle$ 

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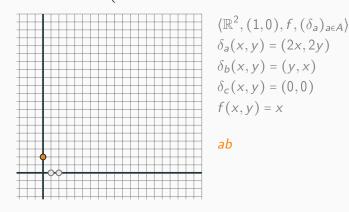


$$\langle \mathbb{R}^2, (1,0), f, (\delta_a)_{a \in A} \rangle$$
  
$$\delta_a(x,y) = (2x,2y)$$
  
$$\delta_b(x,y) = (y,x)$$
  
$$\delta_c(x,y) = (0,0)$$
  
$$f(x,y) = x$$

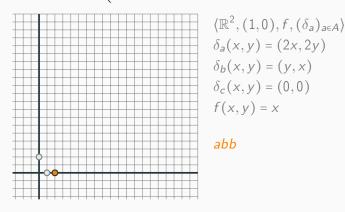
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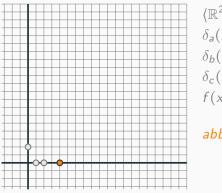
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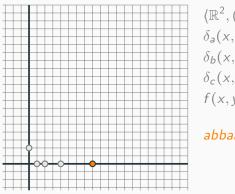
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abba

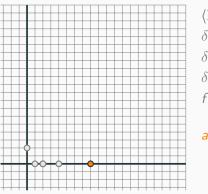
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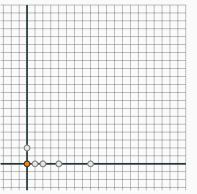
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*abbaa* → 8

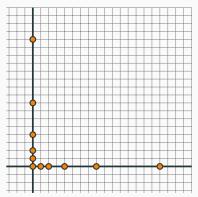
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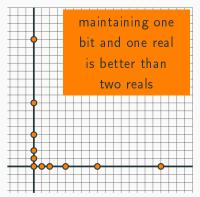
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 $abbaac \mapsto 0$ 

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Hybrid set-vector automata "have"

- a finite set of control states that evolve like DFAs
- a finite vector space for each control state

## Question.

What is a suitable automata model so that minimisation is possible and we retrieve this "hybrid" behaviour?

## Automata as functors

### Automata in Categories: what we already knew

Automata are both algebras for a functor + final map and coalgebras for a functor + initial map

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The coalgebraic view brings its own advantages: (e.g. checking NFA equivalences using up-to techniques for bisimulations)



Thomas Colcombet "Algèbres? Co-algèbres? Mais ils ne sont ni l'un ni l'autre !"

An automaton processes an input, respecting its structure (word, tree, infinite word or tree, trace, ...)

> outputs a quantity in some universe of output values (Boolean values, probabilities, vector space, words, ...)



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Automata are functors!!!

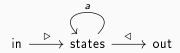
	a	
deterministic automata	$1 \stackrel{\scriptscriptstyle{\mathcal{M}}}{\longrightarrow} Q \stackrel{\scriptstyle{\mathcal{I}}}{\longrightarrow} 2$	in Set
	a	
non-deterministic automata	$1 \stackrel{ ightarrow}{\longrightarrow} Q \stackrel{ ightarrow}{\longrightarrow} 1$	in Rel
	a	
weighted automata	$S \xrightarrow{\simeq} Q \xrightarrow{\sim} S$	in Mod <sub>S</sub>
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Subseq. transducers	$1 \stackrel{\searrow}{\longrightarrow} Q \stackrel{\nearrow}{\longrightarrow} 1$	in Kl $(\mathcal{T})$

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	$\sum$	
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We see a pattern emerging!

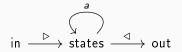
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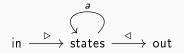
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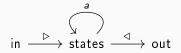
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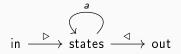
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 $\begin{array}{lll} \mbox{deterministic automata} & \mathcal{A} \colon \mathcal{I} \to \mbox{Set} & \mbox{in } \mapsto \mbox{1 and } \mbox{out } \mapsto \mbox{2} \\ \mbox{non-deterministic automata} & \mathcal{A} \colon \mathcal{I} \to \mbox{Rel} & \mbox{in } \mapsto \mbox{1 and } \mbox{out } \mapsto \mbox{1} \\ \mbox{weighted automata} & \mathcal{A} \colon \mathcal{I} \to \mbox{Mod}_S & \mbox{in } \mapsto \mbox{S and } \mbox{out } \mapsto \mbox{S} \\ \mbox{subseq. transducers} & \mathcal{A} \colon \mathcal{I} \to \mbox{Kl}(\mathcal{T}) & \mbox{in } \mapsto \mbox{1 and } \mbox{out } \mapsto \mbox{1} \end{array}$ 

Languages are functors

 $\mathcal{L}: \mathcal{O} \to \mathcal{C} ,$ 

where  $\mathcal{O}$  is the full subcategory of  $\mathcal{I}$  on objects in and out

in  $\xrightarrow{\triangleright w \triangleleft} : w \in A^*$  out

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A language  $L \subseteq A^*$  can be modelled as a functor  $\mathcal{L}_{Set}: \mathcal{O} \to Set$  so that  $\mathcal{L}_{Set}(in) = 1$  and  $\mathcal{L}_{Set}(out) = 2$ , For all  $w \in A^*$  we have  $\mathcal{L}_{Set}(\rhd w \triangleleft): 1 \to 2$  in Set. Languages are functors

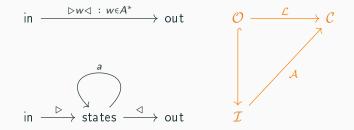
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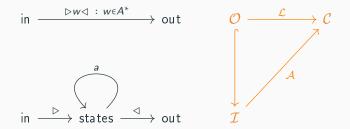
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Alternatively,  $L \subseteq A^*$  can be modelled as a functor  $\mathcal{L}_{\mathsf{Rel}}: \mathcal{O} \to \mathsf{Rel}$  so that  $\mathcal{L}_{\mathsf{Rel}}(\mathsf{in}) = 1$  and  $\mathcal{L}_{\mathsf{Rel}}(\mathsf{out}) = 1$ . For all  $w \in A^*$  we have  $\mathcal{L}_{\mathsf{Rel}}(\rhd w \lhd): 1 \to 1$  in Rel. An automaton  $\mathcal A$  accepts a language  $\mathcal L$  when the next diagram commutes



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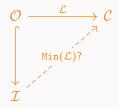


For every language  $\mathcal{L}: \mathcal{O} \to \mathcal{C}$  we have a category Auto<sub>L</sub> of automata accepting  $\mathcal{L}$ .

## Automata as functors: minimization

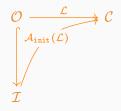
#### Minimial Automaton $\texttt{Min}(\mathcal{L})$ for a Language

When does a 'minimal' automaton accepting a language  $\mathcal L$  exist?



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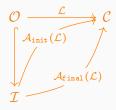


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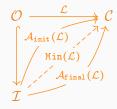


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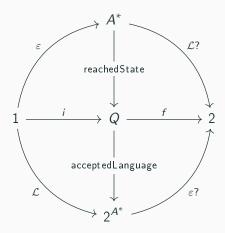
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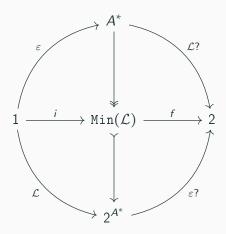
then  $\mathtt{Min}(\mathcal{L})$  is obtained as the factorization

$$\mathcal{A}_{\text{init}}(\mathcal{L}) \twoheadrightarrow \operatorname{Min}(\mathcal{L}) \rightarrowtail \mathcal{A}_{\text{final}}(\mathcal{L}).$$

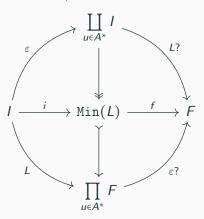
deterministic automata, i.e. (Set, 1, 2)-automata accepting a (Set, 1, 2)-language



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If the output category C has countable powers and copowers, and, and epi-mono factorisation system, then the minimial automaton for L is computed as follows



Thus far we have reinvented the wheel ...



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#### However, the wheel was a pretty awesome invention!

### What if the output category is not nice?

#### Subsequential transducers

the output category has copowers, factorization system, but does not have products.

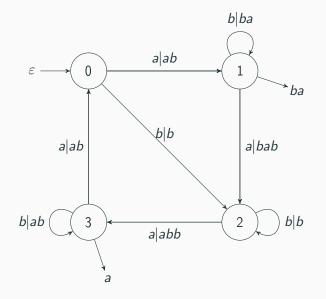
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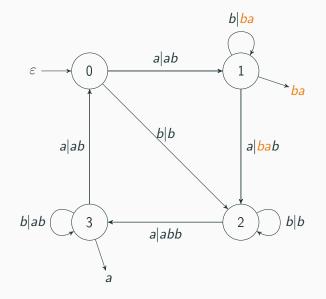
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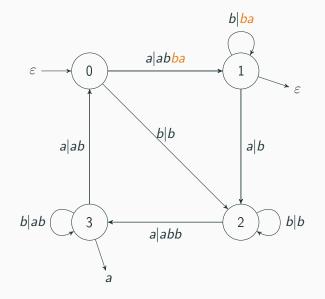
#### Hybrid set-vector automata

a costum-made output category that has all powers and copowers, but where the factorisation system is not "nice" enough to give a meaningful notion of minimization.

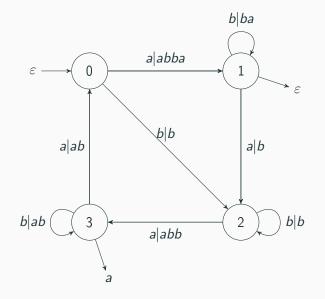
# Subsequential transducers à la Choffrut



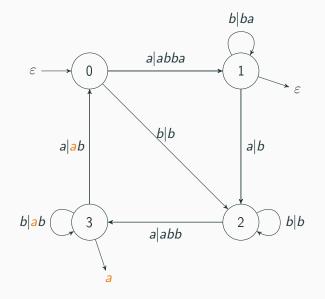




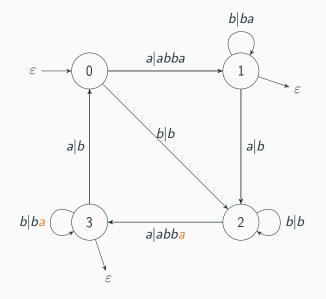
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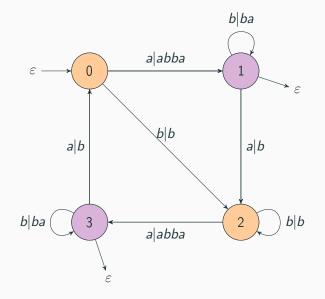


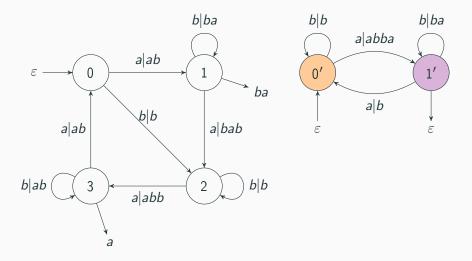
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#### Subsequential transducers as functors

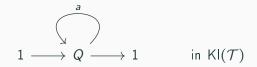
A subsequential transducers with output alphabet  ${\cal B}$  is essentially a functor

 $\mathcal{A}{:}\,\mathcal{I} \to \mathsf{Kl}(\mathcal{T})$ 

for the monad  $\mathcal{T}{:}\mathsf{Set}\to\mathsf{Set}$  defined by

$$\mathcal{T}(X) = B^* \times X + 1.$$

That is, we have the data



#### Subsequential transducers as functors

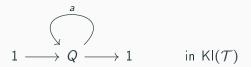
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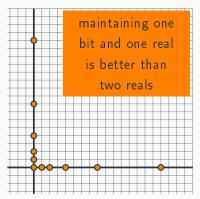
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The category KI( $\mathcal{T}$ ) does not have powers or products!! This is why we cannot just use coalgebras for  $SX = (1 + B^* \times X)^{A^*} \times (1 + B^*)$ , see [Hansen, 2010] "Glueings" of vector spaces

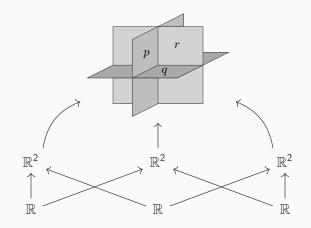
#### Let's backtrack to the "hybrid set-vector" automaton

### The "reachable" vectors are on the "union" of two one-dimensional subspaces.



#### What is the good category to accommodate the new model?

An example of "gluings" of vector spaces i.e. a mono-colimit in Vec



A diagram  $F: \mathcal{D} \to \mathcal{C}$  is called a mono-colimit if it has a mono-cocone in  $\mathcal{C}$ , that is, a cocone where all the injections are monos.

#### Definition

We define Glue(C) as the free completion of C under mono-colimits.

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#### Lemma

The category Glue(C) is complete and cocomplete whenever C is.

In particular, Glue(Vec) has all the required properties so that minimisation works smoothly.

We are interested in effective minimal automata!

deterministic finite automataSet<br/>finite-dim.finite-dim. vector automataVec<br/>fineffective hybrid-set-vector automataGlue<br/>fin (Vec<br/>fin)

where  $\mathsf{Glue}_{\mathsf{fin}}(\mathsf{Vec}_{\mathsf{fin}})$  is the free cocompletion of  $\mathsf{Vec}_{\mathsf{fin}}$  under finite mono-colimits.

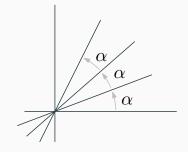
#### Example

#### Consider the weighted language $L: A^* \to \mathbb{R}$ given by

 $L(u) = \cos(\alpha |u|)$ 

for some  $\alpha$  which is not a rational multiple of  $\pi.$ 

The minimal automaton in Glue(Vec) is a countable colimit of one-dimensional spaces.



#### It seems we have "broken" the minimisation wheel ...



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The fix: a factorisation through system

### Conclusions

Our contribution: a new automata model!

The category-theoretic perspective helps with the accurate description of the hybrid set-vector automata model.

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Can we characterise the presheaves that are mono-colimits of representables? (some partial results, e.g. we proved that they preserve equalisers, but that is not sufficient)

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How do we effectively minimise hybrid-set-vector automata?

Adjunctions between output categories lift to adjunctions for "adjoint transpose" languages. Unifying explanation for

- determinization of NFAs
- generalised powerset construction
- reversing automata

What other uses can we find for the "minimization wheel"?

- syntactic monoids, algebras
- minimization by duality
- syntactic spaces with internal monoids

[Gehrke, P., Reggio, ICALP'16, LICS'17]



- [Colcombet, P., ACM SIGLOG april 2017] Automata and minimization.
- [Colcombet, P., MFCS 2017] Automata in the Category of Glued Vector Spaces
- Colcombet, P., CALCO 2017 Automata Minimization: a Functorial Approach