## **Rationality & Recognisability**

An introduction to weighted automata theory Tutorial given at post-WATA 2014 Workshop

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#### Based on

# AUTOMATA THEORY



JACQUES SAKAROVITCH

CAMURIE

Heiko Vogler (Eds.) Handbook of Weighted

Manfred Droste

Werner Kuich

🖄 Springer

Automata

#### Chapter III

Chapter 4

The presentation is also much inspired by joint works with

Sylvain Lombardy (Univ. Bordeaux)

entitled

- On the equivalence and conjugacy of weighted automata, CSR 2006, the journal version is still under prepapration.
- ▶ The validity of weighted automata, CIAA 2012 & IJAC 2013.
- VAUCANSON 2 (2010–2014), a platform for computing with weighted automata.

## Outline of the tutorial

- 1. The model
- 2. Rationality
- 3. Recognisability

## Part I

## The model of weighted automata

## Outline of Part I

Models of computation

for computer science anf for the rest of the world

- I-way Turing machines are equivalent to finite automata
- Once the finite automaton model is well-established, it is generalised to weighted automata
- ▶ Weigthed automata are the linear algebra of computer science



Paradigm of a machine for the computer scientists



Paradigm of a machine for the rest of the world



Paradigm of a machine for the rest of the world



 $x \in \mathbb{R}^n$ ,  $y \in \mathbb{R}^m$ 

Paradigm of a machine for the rest of the world





The input belongs to a *free monoid*  $A^*$ 



The input belongs to a *free monoid*  $A^*$ The output belongs to the *Boolean semiring*  $\mathbb{B}$ 



The input belongs to a *free monoid*  $A^*$ The output belongs to the *Boolean semiring*  $\mathbb{B}$ The function realised is *a language* 

$$\mathbb{B} \ni k \quad \longleftarrow \quad (u, v) \in A^* \times B^*$$

The input belongs to a *direct product of free monoids*  $A^* \times B^*$ The output belongs to *the Boolean semiring*  $\mathbb{B}$ 

$$\mathbb{B} \ni k \quad \longleftarrow \quad \mathbb{R}$$
$$(u, v) \in A^* \times B^*$$
$$R \subseteq A^* \times B^*$$

The input belongs to a *direct product of free monoids*  $A^* \times B^*$ The output belongs to *the Boolean semiring*  $\mathbb{B}$ The function realised is *a relation between words* 

## The simplest Turing machine





Direction of movement of the read head

The 1-way 1-tape Turing Machine (1W1TTM)





bab  $\in A^*$ 



bab  $\in A^*$ 





bab  $\in A^*$ 



 $L(\mathcal{B}_1) = \{ w \in A^* | w \in A^* b A^* \} = \{ w \in A^* | |w|_b \ge 1 \}$ 

## Rational (or regular) languages

## Languages accepted (or recognized) by finite automata

Languages described by rational (or regular) expressions

Languages defined by MSO formulae

Remarkable features of the finite automaton model

Decidable equivalence (decidable inclusion)

**Closure under complement** 

Canonical automaton (minimal deterministic automaton)

## The 1W kT Turing machine



 $\rightarrow$  Direction of movement of the k read heads

The 1-way *k*-tape Turing Machine (1W kT TM)















Features and shortcomings of the finite transducer model

**Closure under composition** 

Closure of Chomsky classes under rational relations

Interesting subclasses of rational relations

Non closure under complement

Undecidable equivalence



 $L(\mathcal{B}_1)\subseteq A^*$ 







$$L(\mathcal{B}_1) = L(\mathcal{B}_1') = ig\{ w \in A^* \, \Big| \, |w|_b \geqslant 1 ig\}$$



$$L(\mathcal{B}_1) = L(\mathcal{B}_1') = ig\{ w \in A^* \, ig| \, |w|_b \geqslant 1 ig\} = A^* b A^*$$



Counting the number of successful computations  $|\mathcal{B}_1|: bab \longmapsto 2 \qquad |\mathcal{B}'_1|: bab \longmapsto 1$ 



Counting the number of successful computations  $|\mathcal{B}_1|: w \longmapsto |w|_b \qquad |\mathcal{B}_1'|: w \longmapsto 1$ 

#### A new automaton model



The input belongs to a *free monoid*  $A^*$ 

The output belongs to the *integer semiring*  $\mathbb{N}$
#### A new automaton model



The input belongs to a *free monoid*  $A^*$ The output belongs to the *integer semiring*  $\mathbb{N}$ The function realised is *a function from*  $A^*$  to  $\mathbb{N}$ 

#### A new automaton model



The input belongs to a *free monoid*  $A^*$ The output belongs to the *integer semiring*  $\mathbb{N}$ The function realised is *a function from*  $A^*$  to  $\mathbb{N}$ we call it *a series* 

#### A new automaton model



 $s_1 = b + ab + ba + 2bb + aab + \cdots + 2bba + 3bbb + \cdots$ 

The input belongs to a *free monoid*  $A^*$ The output belongs to the *integer semiring*  $\mathbb{N}$ The function realised is *a function from*  $A^*$  to  $\mathbb{N}$ we call it *a series* 











- Weight of a path c: product of the weights of transitions in c
- Weight of a word w: sum of the weights of paths with label w



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 $bab \mapsto 1+4=5$ 



• Weight of a path c: product of the weights of transitions in c

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 $b a b \mapsto 1 + 4 = 5 = \langle 101 \rangle_2$ 



• Weight of a path c: *product* of the weights of transitions in c

Weight of a word w: sum of the weights of paths with label w

$$bab \mapsto 1+4=5$$
  $|\mathcal{C}_1|: A^* \longrightarrow \mathbb{N}$ 



• Weight of a path c: product of the weights of transitions in c

Weight of a word w: sum of the weights of paths with label w

 $|C_1| = b + ab + 2ba + 3bb + aab + 2aba + \dots + 5bab + \dots$ 



 Weight of a path c: product, that is, the sum, of the weights of transitions in c
 Weight of a word w: sum, that is, the min of the weights of paths with label w

 $b a b \mapsto \min(1 + 0 + 1, 0 + 1 + 0) = 1$   $|\mathcal{L}_1|: A^* \longrightarrow \mathbb{Z}\min(1 + 0) = 1$ 



 Weight of a path c: product, that is, the sum, of the weights of transitions in c
 Weight of a word w:

sum, that is, the min of the weights of paths with label w

 $|C_1| = 01_{A^*} + 0a + 0b + 1ab + 1ba + 0bb + \dots + 1bab + \dots$ 

The weighted automaton model (system theory mode)



The input belongs to a *free monoid*  $A^*$ 

The output belongs to a semiring  $\mathbb K$ 

The function realised is a function from  $A^*$  to  $\mathbb{K}$ : a series in  $\mathbb{K}\langle\!\langle A^* \rangle\!\rangle$ 

The weighted automaton model (sytem theory mode)

$$\mathbb{K} \ni k \quad \textbf{s} \quad \textbf{(u,v)} \in A^* \times B^*$$
$$s \colon A^* \times B^* \to \mathbb{K} \qquad s \in \mathbb{K} \langle\!\langle A^* \times B^* \rangle\!\rangle$$

The input belongs to a *direct product of free monoids*  $A^* \times B^*$ The output belongs to a *semiring*  $\mathbb{K}$ The function realised is *a function from*  $A^* \times B^*$  to  $\mathbb{K}$ : *a series* in  $\mathbb{K}\langle\!\langle A^* \times B^* \rangle\!\rangle$ 

## Richness of the model of weighted automata

- ► B 'classic' automata
- ▶ N 'usual' counting
- $\triangleright$  Z, Q, R numerical multiplicity
- $\land \ \ \langle \mathbb{Z} \cup +\infty, \min, + \rangle$
- $\mathfrak{P}(B^*) = \mathbb{B}\langle\!\langle B^* \rangle\!\rangle$
- $\mathfrak{P}(F(B))$

Min-plus automata •  $\langle \mathbb{Z}, \min, \max \rangle$  fuzzy automata transducers

- $\mathbb{N}\langle\langle B^* \rangle\rangle$  weighted transducers
  - pushdown automata

# Series play the role of languages

 $\mathbb{K}\langle\!\langle A^* \rangle\!\rangle$  plays the role of  $\mathfrak{P}(A^*)$ 

# Series play the role of relations

 $\mathbb{K}\langle\!\langle A^* \times B^* \rangle\!\rangle$  plays the role of  $\mathfrak{P}(A^* \times B^*)$ 

# Weighted automata theory

is the linear algebra

of computer science

# Part II

# Rationality

## Outline of Part II

- Definition of rational series
- The Fundamental Theorem of Finite Automata What can be computed by a finite automaton is exactly what can be computed by the star operation (together with the algebra operations)
- Morphisms of weighted automata

# The semiring $\mathbb{K}\langle\!\langle A^* \rangle\!\rangle$



 $\{(u, v) \mid uv = w\}$  finite  $\implies$  Cauchy product well-defined

 $\mathbb{K}\langle\!\langle A^* \rangle\!\rangle$  is a semiring

## The semiring $\mathbb{K}\langle\!\langle M \rangle\!\rangle$



 $\forall m \{(x,y) \mid xy = m\}$  finite  $\implies$  Cauchy product well-defined

# The semiring $\mathbb{K}\langle\!\langle M \rangle\!\rangle$

Conditions for  $\{(x, y) | xy = m\}$  finite for all *m* Definition *M* is graded if *M* equipped with a length function  $\varphi$  $\varphi: M \to \mathbb{N}$   $\varphi(mm') = \varphi(m) + \varphi(m')$ 

*M* f.g. and graded 
$$\implies$$
  $\mathbb{K}\langle\!\langle M \rangle\!\rangle$  is a semiring

Examples

 $\mathbb{M}$  trace monoid, then  $\mathbb{K}\langle\!\langle M \rangle\!\rangle$  is a semiring  $\mathbb{K}\langle\!\langle A^* \times B^* \rangle\!\rangle$  is a semiring

F(A), the free group on A, is not graded

# The algebra $\mathbb{K}\langle\!\langle M \rangle\!\rangle$

**K** semiring **𝔅** M f.g. graded monoid  $s: M \to \mathbb{K}$   $s: m \longmapsto \langle s, m \rangle$  $s \in \mathbb{K}\langle\!\langle A^* \rangle\!\rangle$  $s = \sum \langle s, m \rangle m$  $m \in M$ Point-wise addition  $\langle s+t,m\rangle = \langle s,m\rangle + \langle t,m\rangle$  $\langle st,m\rangle = \sum \langle s,x\rangle \langle t,y\rangle$ Cauchy product x v = m $\langle ks, m \rangle = k \langle s, m \rangle$ External multiplication

 $\mathbb{K}\langle\!\langle M \rangle\!\rangle$  is an algebra

$$t \in \mathbb{K}$$
  $t^* = \sum_{n \in \mathbb{N}} t^n$ 

How to define infinite sums ?

One possible solution

Topology on  $\ \mathbb{K}$ 

Definition of summable families and of their sum

 $t^*$  defined if  $\{t^n\}_{n\in\mathbb{N}}$  summable

Other possible solutions

axiomatic definition of star, equational definition of star





- $orall \mathbb{K}$   $(0_{\mathbb{K}})^* = 1_{\mathbb{K}}$
- $\mathbb{K} = \mathbb{N}$   $\forall x \neq 0$   $x^*$  not defined.
- $\mathbb{K} = \mathcal{N} = \mathbb{N} \cup \{+\infty\}$   $\forall x \neq 0$   $x^* = \infty$ .
- $\mathbb{K} = \mathbb{Q}$   $(\frac{1}{2})^* = 2$  with the natural topology,  $(\frac{1}{2})^*$  is undefined with the discrete topology.



In any case

 $t^* = 1_{\mathbb{K}} + t \, t^*$ 

Star has the same flavor as the inverse

If  $\mathbb{K}$  is a ring

 $t^*(1_{\mathbb{K}}-t)=1_{\mathbb{K}}$ 

$$\frac{1_{\mathbb{K}}}{1_{\mathbb{K}}-t}=1_{\mathbb{K}}+t+t^2+\cdots+t^n+\cdots$$

Star of series

$$s \in \mathbb{K}\langle\!\langle A^* 
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 When is  $s^* = \sum_{n \in \mathbb{N}} s^n$  defined ?

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Topology on  $\mathbb{K}$  yields topology on  $\mathbb{K}\langle\!\langle A^* \rangle\!\rangle$ 

Topology on  $\mathbb K$  given by a distance  $c \qquad \qquad c \colon \mathbb K \times \mathbb K \to \mathbb R_+$ 

Topology on  $\mathbb{K}$  given by a *distance* **c**  $\mathbf{c} : \mathbb{K} \times \mathbb{K} \to \mathbb{R}_+$ 

- $\mathbf{c}(x, y) = \mathbf{c}(y, x)$ symmetry: •
- •

positivity:  $\mathbf{c}(x, y) > 0$  if  $x \neq y$  and  $\mathbf{c}(x, x) = 0$ 

triangular inequality:  $\mathbf{c}(x, y) \leq \mathbf{c}(x, z) + \mathbf{c}(y, z)$ •

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A sequence  $\{k_n\}_{n\in\mathbb{N}}$  of elements of  $\mathbb{K}$  converges toward k

 $k = \lim_{n \to +\infty} k_n \qquad \forall \varepsilon > 0 \quad \exists N \in \mathbb{N} \quad \forall n \ge N \qquad \mathbf{c}(k_n, k) \leqslant \varepsilon$ 

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### Remark Always assume $\mathbf{c}(x, y) \leq 1$

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#### Remark

Always assume  $\mathbf{c}(x, y) \leqslant 1$ 

#### Remark

Discrete topology  $x \neq y \Rightarrow \mathbf{c}(x, y) = 1$ Converging sequences = stationnary sequences
- ► B, N, Z,
- $\blacktriangleright \mathcal{M} = \langle \mathbb{N}, \mathsf{min}, + \rangle$
- ▶  $\mathbb{Q}$ ,  $\mathbb{Q}_+$ ,  $\mathbb{R}$ ,  $\mathbb{R}_+$

discrete topology discrete topology "natural distance"

 $\begin{array}{l} \begin{array}{l} \text{Definition} \\ \{s_n\}_{n\in\mathbb{N}}, \ s_n\in\mathbb{K}\langle\!\langle A^*\rangle\!\rangle, \ \text{converges toward } s \ \text{iff} \\ \forall w\in A^* \ \langle s_n, w\rangle \ \text{converges toward } \langle s, w\rangle \ \text{in } \mathbb{K}. \end{array} \end{array}$ 

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The simple convergence topology on  $\mathbb{K}\langle\!\langle A^* \rangle\!\rangle$  is defined by a distance **d** :

If  $\mathbb K$  is equipped with the discrete topology:

 $\mathbf{e}(s,t) = \min \left\{ n \in \mathbb{N} \mid \exists w \in A^* \mid w \mid = n \text{ and } \langle s,w 
angle 
eq \langle t,w 
angle 
ight\}$ ,  $\mathbf{d}(s,t) = 2^{-\mathbf{e}(s,t)}$ 

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The simple convergence topology on  $\mathbb{K}\langle\!\langle A^* \rangle\!\rangle$  is defined by a distance **d** :

If  $\mathbb K$  is equipped with the topology defined by the distance  $c{:}$ 

$$\mathbf{d}(s,t) = \frac{1}{2} \sum_{n \in \mathbb{N}} \left( \frac{1}{2^n} \max \left\{ \mathbf{c}(\langle s, w \rangle, \langle t, w \rangle) \mid |w| = n \right\} \right)$$

# Proposition

If  $\mathbb{K}$  is a topological semiring, then  $\mathbb{K}\langle\!\langle A^* \rangle\!\rangle$ , equipped with the simple convergence topology, is a topological semiring.

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Summable family of series.

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# Proposition

A locally finite family of series is summable.

$$s \in \mathbb{K}\langle\!\langle A^* 
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 When is  $s^* = \sum_{n \in \mathbb{N}} s^n$  defined ?

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 $orall s \in \mathbb{K} \langle\!\langle A^* 
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angle \qquad s = s_0 + s_{\mathsf{p}} \qquad ext{with} \quad s_{\mathsf{p}} \;\; ext{proper}$ 

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 $\mathbb{K}$  strong product of two summable families summable.

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#### Definition

 $\mathbbm{K}$  strong product of two summable families summable.

#### Proposition

 $\mathbb{K}$  strong,  $s \in \mathbb{K}\langle\!\langle A^* 
angle$   $s^*$  is defined iff  $s_0^*$  is defined  $s^* = (s_0^* s_p)^* s_0^* = s_0^* (s_p s_0^*)^*$ 

# **Rational series**

 $\mathbb{K}\langle A^*\rangle\subseteq\mathbb{K}\langle\!\langle A^*\rangle\!\rangle\qquad \text{ subalgebra of polynomials}$ 

 $\mathbb{K}$ Rat  $A^*$  closure of  $\mathbb{K}\langle A^* \rangle$  under

- sum
- product
- exterior multiplication
- and star

 $\mathbb{K}$ Rat  $A^* \subseteq \mathbb{K}\langle\!\langle A^* \rangle\!\rangle$ 

subalgebra of rational series

# Theorem $s \in \mathbb{K}\operatorname{Rat} A^* \iff \exists A \in \mathbb{K}\operatorname{WA}(A^*) \quad s = |A|$

Theorem

 $s \in \mathbb{K}\operatorname{Rat} A^* \quad \iff \quad \exists \mathcal{A} \in \mathbb{K}\operatorname{WA}(A^*) \quad s = |\mathcal{A}|$ 

Kleene theorem ?

# Theorem $s \in \mathbb{K} \operatorname{Rat} A^* \iff \exists A \in \mathbb{K} \operatorname{WA} (A^*) \quad s = |A|$

# Kleene theorem ?

#### Theorem

*M* finitely generated graded monoid

 $s \in \mathbb{K}\operatorname{Rat} M \quad \iff \quad \exists \mathcal{A} \in \mathbb{K}\operatorname{WA}(M) \quad s = |\mathcal{A}|$ 



# Standard automaton

$$\mathsf{E}_1 = (\frac{1}{6}a^* + \frac{1}{3}b^*)^*$$

#### Standard automaton



- Automata are (essentially) matrices:  $\mathcal{A} = \langle I, E, T \rangle$
- Computing the behaviour of an automaton boils down to solving a linear system  $X = E \cdot X + T$  (s)
- Solving the linear system (s) amounts to invert the matrix (Id − E) (hence the name rational)
- ► The inversion of Id E is realised by an infinite sum  $Id + E + E^2 + E^3 + \cdots$ : the star of E



$$\mathcal{C}_1 = \langle I_1, E_1, T_1 \rangle = \left\langle \begin{pmatrix} 1 & 0 \end{pmatrix}, \begin{pmatrix} a+b & b \\ 0 & 2a+2b \end{pmatrix}, \begin{pmatrix} 0 \\ 1 \end{pmatrix} \right\rangle$$
.

$$\mathcal{A} = \langle I, E, T \rangle$$
  $E = \text{incidence matrix}$ 

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# Notation wl(x) = weighted label of xIn our model, e transition $\Rightarrow wl(e) = k a$

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$$E_{p,q} = \sum \left\{ \mathsf{wl}(e) \mid e \quad \text{transition from } p \text{ to } q \right\}$$

$$\mathcal{A} = \langle I, E, T \rangle$$
  $E = \text{incidence matrix}$ 

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m transition} \; {
m from} \; p \; {
m to} \; q 
ight\}$$

#### Lemma

$$E_{p,q}^{n} = \sum \{ wl(c) \mid c \text{ computation from } p \text{ to } q \text{ of length } n \}$$

 $\mathcal{A} = \langle I, E, T \rangle$  E = incidence matrix

 $E_{p,q} = \sum \{ \mathbf{wl}(e) \mid e \text{ transition from } p \text{ to } q \}$ 

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$$E^* = \sum_{n \in \mathbb{N}} E^n$$

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 $E_{p,q}^* = \sum \left\{ \mathbf{wl}(c) \mid c \text{ computation from } p \text{ to } q \right\}$ 

$$|\mathcal{A}| = I \cdot E^* \cdot T$$



 $\mathbb{K} \text{ semiring} \qquad M \text{ graded monoid}$  $\mathbb{K}\langle\!\langle M \rangle\!\rangle^{Q \times Q} \text{ is isomorphic to } \mathbb{K}^{Q \times Q} \langle\!\langle M \rangle\!\rangle$  $E \in \mathbb{K}\langle\!\langle M \rangle\!\rangle^{Q \times Q} \qquad E \text{ proper } \Longrightarrow E^* \text{ defined}$  $\frac{\mathsf{Theorem}}{\mathsf{The entries of } E^* \text{ are}}$ 

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**K** semiring M graded monoid  $\mathbb{K}^{Q \times Q} \langle\!\langle M \rangle\!\rangle$  $\mathbb{K}\langle\!\langle M \rangle\!\rangle^{Q \times Q}$ is isomorphic to  $E \in \mathbb{K}\langle\!\langle M \rangle\!\rangle^{Q \times Q}$  $E^*$  defined *E* proper  $\implies$ Theorem The entries of  $E^*$  are in the rational closure of the entries of E

#### Theorem

The family of behaviours of weighted automata over Mwith coefficients in  $\mathbb{K}$  is rationally closed.

# The collect theorem

 $\mathbb{K}\langle\!\langle A^* \times B^* \rangle\!\rangle \text{ is isomorphic to } [\mathbb{K}\langle\!\langle B^* \rangle\!\rangle] \langle\!\langle A^* \rangle\!\rangle$ 

Theorem

Under the above isomorphism,

 $\mathbb{K}$ Rat  $A^* \times B^*$  corresponds to  $[\mathbb{K}$ Rat  $B^*]$  Rat  $A^*$ 

# Morphisms of automata

1. Automata are structures.
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What are the morphisms for those structures?

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2. Automata realise series

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Can we find an equivalent smaller automaton?

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Can we find an equivalent smaller automaton? of minimal size?

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What are the morphisms for those structures?

2. Automata realise series

Can we find an equivalent smaller automaton? of minimal size? that respects the structure?

#### Minimisation of deterministic automata



The image of a path is a path

- The image of a path is a path
- The image of a successful path is a successful path

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 $|\mathcal{A}| \subseteq |\mathcal{B}|$ 

#### Problem:

Find conditions such that  $|\mathcal{A}| = |\mathcal{B}|$ 

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Solution:

Local conditions

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Solution:

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Problem:

Neither the definition, nor the solution, extend directly to  $\mathbb B$ -automata

Definition Let  $\mathcal{A} = \langle I, E, T \rangle$  and  $\mathcal{B} = \langle J, F, U \rangle$  be two K-automata.  $\mathcal{A}$  is conjugate to  $\mathcal{B}$  if  $\exists X \quad \mathbb{K}$ -matrix IX = J, EX = XF, and T = XU

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$$X_1 = egin{pmatrix} 1 & 0 & 0 & 0 \ 0 & -1 & 1 & 0 \ 0 & 1 & 1 & 0 \ 0 & 0 & 0 & 1 \end{pmatrix}$$

.

 $\mathcal{B}_1$ 



 $\mathcal{A}_1 \stackrel{X_1}{\Longrightarrow} \mathcal{B}_1$ 

$$\mathcal{C}' = \left\langle (1 \ 0 \ 0), \begin{pmatrix} 0 & z & 0 \\ 0 & 0 & z \\ 0 & 0 & 2z \end{pmatrix}, \begin{pmatrix} 0 \\ 1 \\ 2 \end{pmatrix} \right\rangle \qquad \mathcal{A}' = \left\langle (1 \ 0), \begin{pmatrix} 0 & z \\ 0 & 2z \end{pmatrix}, \begin{pmatrix} 0 \\ 1 \end{pmatrix} \right\rangle$$
$$(1 \ 0 \ 0) \cdot \begin{pmatrix} 1 & 0 \\ 0 & 1 \\ 0 & 2z \end{pmatrix} = (1 \ 0),$$
$$\begin{pmatrix} 0 & z & 0 \\ 0 & 0 & z \\ 0 & 0 & 2z \end{pmatrix} \cdot \begin{pmatrix} 1 & 0 \\ 0 & 1 \\ 0 & 2 \end{pmatrix} = \begin{pmatrix} 1 & 0 \\ 0 & 1 \\ 0 & 2 \end{pmatrix} \cdot \begin{pmatrix} 0 & z \\ 0 & 2z \end{pmatrix},$$
$$\begin{pmatrix} 0 \\ 1 \\ 2 \end{pmatrix} = \begin{pmatrix} 1 & 0 \\ 0 & 1 \\ 0 & 2 \end{pmatrix} \cdot \begin{pmatrix} 0 \\ 1 \\ 0 \end{pmatrix}$$

 $\begin{pmatrix} 1 & 0 \\ 0 & 1 \\ 0 & 2 \end{pmatrix}$ 

2*z* 

1*z* 

 $\mathcal{A}'$ 



 $\mathcal{C}'$ 

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Definition A map  $\varphi: Q \to R$  defines a  $(Q \times R)$ -amalgamation matrix  $H_{\varphi}$  $\varphi_2: \{j, r, s, u\} \to \{i, q, t\}$  defines  $H_{\varphi_2} = \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}$ 

**Directed** notion

Directed notion Price to pay for the weight

#### Morphisms of weighted automata b а а b $\mathcal{C}_2$ 2*b* 2a b b 2 b 4*a* 2*b* S и 2*b* 4*b*



#### Morphisms of weighted automata а Ь $\mathcal{C}_2$ 2.b 2.a b b 2 b 4 a $H_{\varphi_2} = \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}$ 2 b $\varphi_2: \{j, r, s, u\} \rightarrow \{i, q, t\}$ S *u* )→ 2 b 4*b*



Directed notion Price to pay for the weight

Directed notion Price to pay for the weight
Definition  $\mathcal{A} = \langle I, E, T \rangle$  and  $\mathcal{B} = \langle J, F, U \rangle$  K-automata of dimension Q and R. A map  $\varphi \colon Q \to R$  defines an In-morphism  $\varphi \colon \mathcal{A} \to \mathcal{B}$ if  $\mathcal{B}$  is conjugate to  $\mathcal{A}$  by the matrix  ${}^{t}H_{\varphi} : \mathcal{B} \stackrel{{}^{t}H_{\varphi}}{\Longrightarrow} \mathcal{A}$   $\int {}^{t}H_{\varphi} = I, \qquad F {}^{t}H_{\varphi} = {}^{t}H_{\varphi} E, \qquad U = {}^{t}H_{\varphi} T$  $\mathcal{B}$  is a co-quotient of  $\mathcal{A}$ 

Directed notion Price to pay for the weight





#### Morphisms of weighted automata а Ь $\mathcal{C}_2$ 2.b 2.a b b 2 b 4 a $H_{\varphi_2} = \begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix}$ 2 b $\varphi_2$ : $\{j, r, s, u\} \rightarrow \{i, q, t\}$ S $u \rightarrow$ 2 b 4*b*



 $\begin{array}{l} \begin{array}{l} \text{Definition} \\ \mathcal{A} = \langle I, E, T \rangle \ \text{and} \ \mathcal{B} = \langle J, F, U \rangle \\ & \mathbb{K} \text{-automata} \\ & \text{of dimension} \ \mathcal{Q} \ \text{and} \ \mathcal{R}. \end{array} \\ \text{A map} \ \varphi \colon \mathcal{Q} \to \mathcal{R} \ \text{defines} \ \text{ an Out-morphism} \ \varphi \colon \mathcal{A} \to \mathcal{B} \\ & \text{if } \mathcal{A} \ \text{is conjugate to} \ \mathcal{B} \ \text{ by the matrix} \ H_{\varphi} \colon \mathcal{A} \xrightarrow{H_{\varphi}} \mathcal{B} \\ & \mathcal{B} \ \text{ is a quotient of} \ \mathcal{A} \end{array}$ 

Theorem Every K-automaton has a minimal quotient that is effectively computable (by Moore algorithm).

A practical look at conjugacy by  $H_{\varphi}$ 

$$IH_{\varphi} = J, \qquad EH_{\varphi} = H_{\varphi}F, \quad \text{and} \quad T = H_{\varphi}U$$

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- Merging states p and q realises an Out-morphism if adding columns p and q in E yields a matrix whose lines p and q are equal

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- Multiplying F by  $H_{\varphi}$  on the left amounts to *duplicate lines*
- Merging states p and q realises an Out-morphism if
  adding columns p and q in E yields
  a matrix whose lines p and q are equal
  (and if T<sub>p</sub> = T<sub>q</sub>)

$$\underbrace{\begin{pmatrix} a+b & b & b & b \\ 0 & 2a+2b & 0 & 2b \\ 0 & 0 & 2a+2b & 2b \\ 0 & 0 & 0 & 4a+4b \end{pmatrix}}_{R_2} R_2$$

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$$\underbrace{\begin{pmatrix} a+b & 2b & b \\ 0 & 2a+2b & 2b \\ 0 & 0 & 4a+4b \end{pmatrix}}_{Q_2} \quad \begin{cases} Q_2 \\ Q$$

# Part III

# Recognisability