

# Quantitative Languages

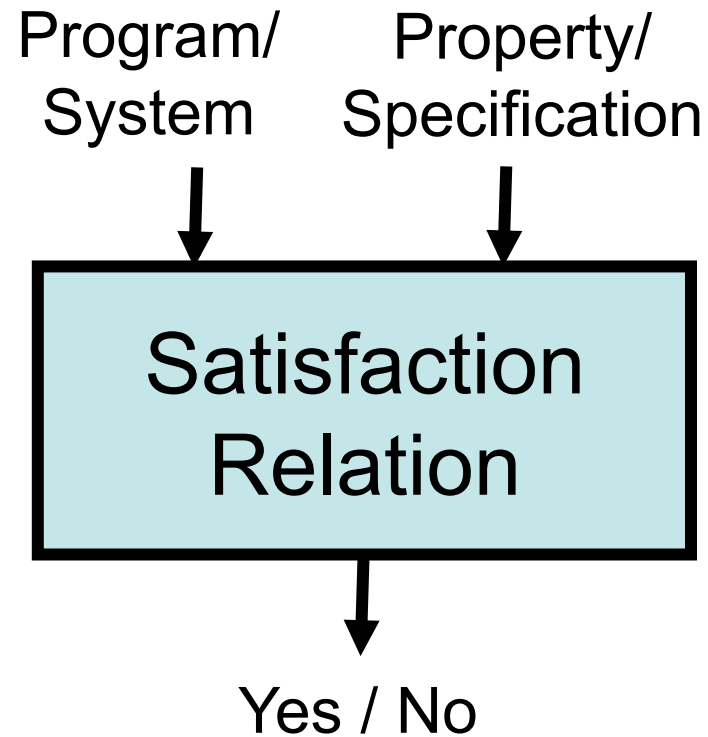
Laurent Doyen  
LSV, ENS Cachan & CNRS

joint work with Krishnendu Chatterjee and  
Tom Henzinger (IST Austria)

(CSL'08, LICS'09)

# Model-Checking

---



- perhaps a proof
- perhaps some counterexamples

# Model-Checking

---

Finite  
automaton

Program/  
System

Property/  
Specification

Formula

Every request is  
followed by a grant



Yes / No

# Model-Checking

---

Finite  
automaton

Program/  
System

Property/  
Specification

Formula

Every request is  
followed by a grant



Yes / No

Model-checking is boolean

- a trace is either good or bad

# Quantitative Analysis

---

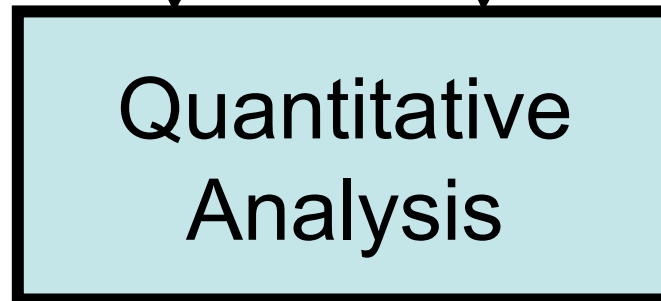
Finite  
automaton

Program/  
System

Property/  
Specification

Formula

Every request is  
followed by a grant



Value (**R**)

-Measure of “fit” between system and spec

-e.g. average number of requests  
immediately granted

# Quantitative Analysis

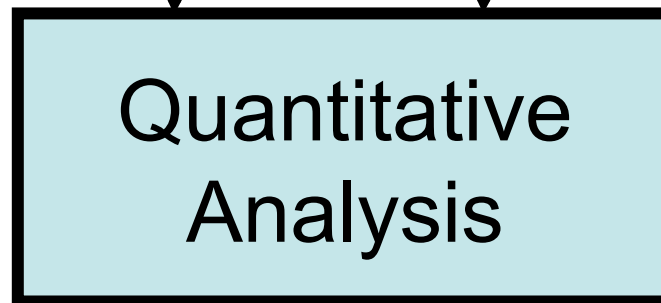
---

Finite  
automaton

Program/  
System #1

Program/  
System #2

Every request is  
followed by a grant



Distance (**R**)

- Comparing two implementations  
e.g. cost or quality measure

# Quantitative Model-checking

---

Is there a Quantitative Framework with

- an appealing mathematical formulation,
- useful expressive power, and
- good algorithmic properties ?

(Like the boolean theory of  $\omega$ -regularity.)

Note: “Quantitative” is more than “timed” and “probabilistic”

# Quantitative languages

---

A language is a boolean function:

$$L : \Sigma^{\omega} \rightarrow \{0, 1\}$$



# Quantitative languages

---

A language is a boolean function:

$$L : \Sigma^{\omega} \rightarrow \{0, 1\}$$

A **quantitative** language is a function:

$$L : \Sigma^{\omega} \rightarrow \mathbb{R}$$

$L(w)$  can be interpreted as:

- the amount of some resource needed by the system to produce  $w$  (power, energy, time consumption),
- a reliability measure (the average number of “faults” in  $w$ ).

# Quantitative languages

---

## Quantitative language inclusion

Is  $L_A(w) \leq L_B(w)$  for all words  $w$  ?

$L_A(w)$	$L_B(w)$
peak resource consumption	resource bound
Long-run average response time	Average response-time requirement

# Outline

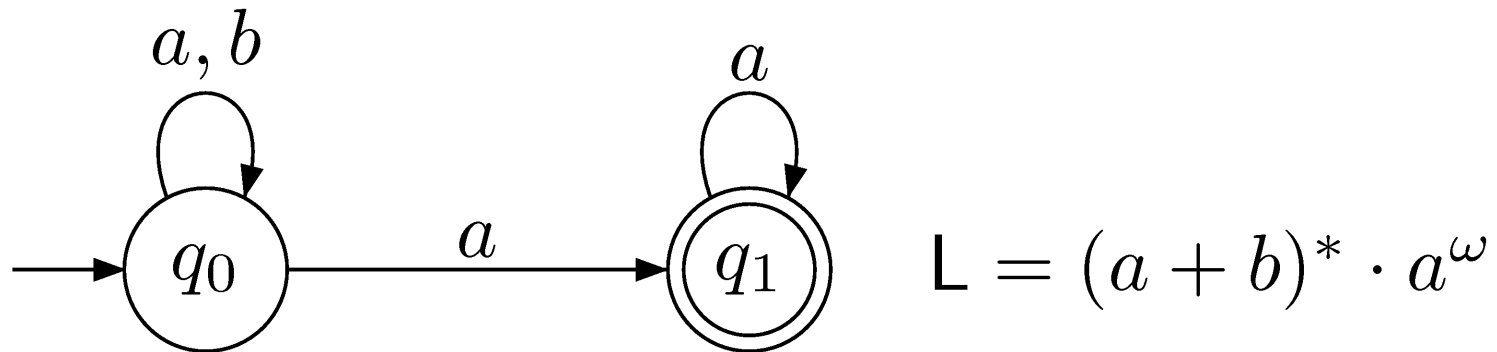
---

- Motivation
- **Weighted automata**
- Decision problems
- Expressive power
- Closure properties

# Automata

---

Boolean languages are generated by finite automata.

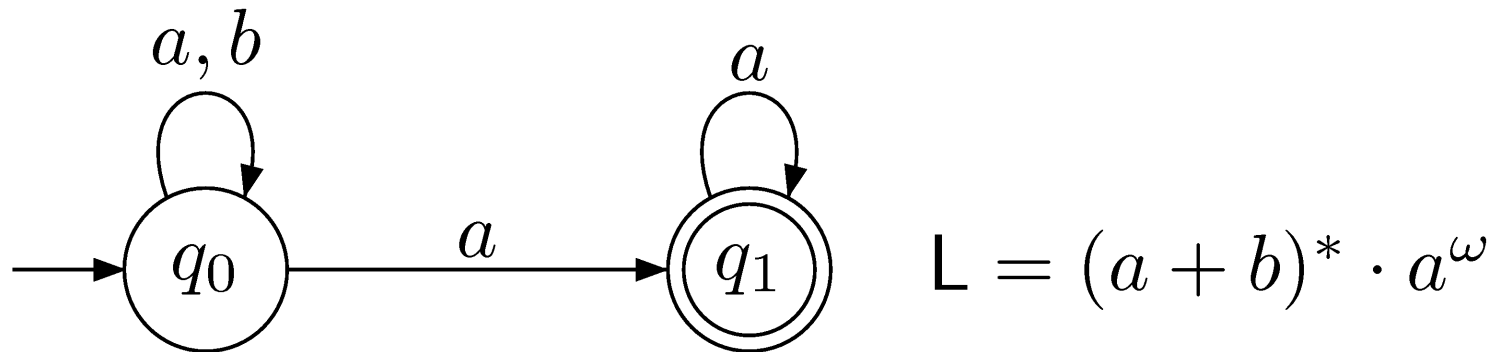


Nondeterministic Büchi automaton

# Automata

---

Boolean languages are generated by finite automata.



Nondeterministic Büchi automaton

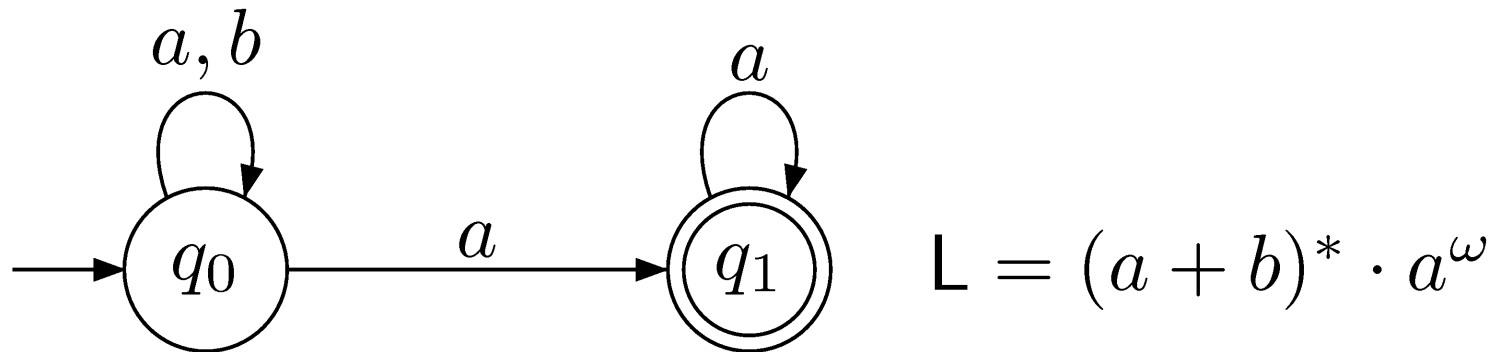
Value of a run  $r$ :  $\text{Val}(r) = 1$  if an accepting state occurs  $\infty$ -ly often in  $r$

0 otherwise

# Automata

---

Boolean languages are generated by finite automata.



Nondeterministic Büchi automaton

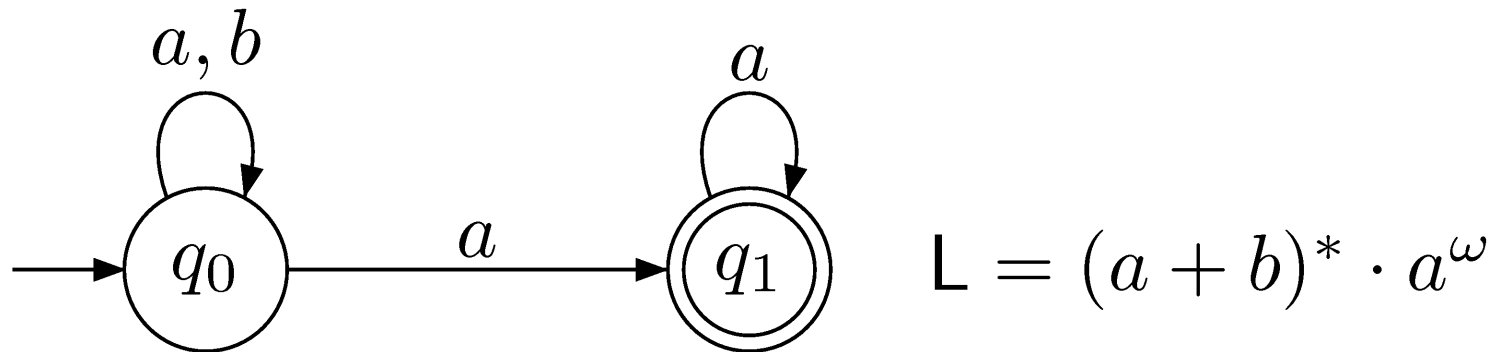
Value of a run  $r$ :  $\text{Val}(r) = 1$  if an accepting state occurs  $\infty$ -ly often in  $r$

Value of a word  $w$ :  $\text{max of } \{\text{values of the runs } r \text{ over } w\}$

# Automata

---

Boolean languages are generated by finite automata.



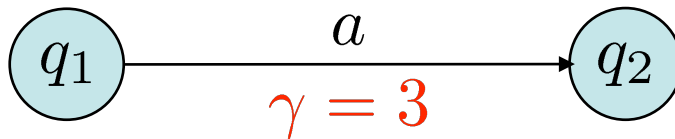
Nondeterministic Büchi automaton

$L_A(w) = \max$  of  $\{\text{Val}(r) \mid r \text{ is a run of } A \text{ over } w\}$

# Weighted automata

---

Quantitative languages are generated by **weighted automata**.



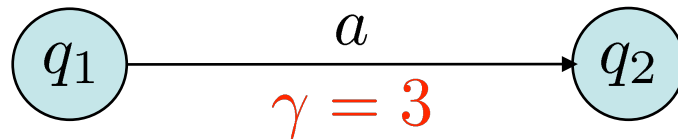
Weight function  $\gamma : Q \times \Sigma \times Q \rightarrow \mathbb{Q}$



# Weighted automata

---

Quantitative languages are generated by **weighted automata**.



Weight function  $\gamma : Q \times \Sigma \times Q \rightarrow \mathbb{Q}$

Value of a word  $w$ : **max** of {values of the runs  $r$  over  $w$ }

Value of a run  $r$ : **Val**( $r$ )

where  $\text{Val} : \mathbb{Q}^\omega \rightarrow \mathbb{R}$  is a value function

# Some value functions

---

For  $v = v_0v_1 \dots$  ( $v_i \in \mathbb{Q}$ ), let

( $v_i \in \{0,1\}$ )

- $\text{Sup}(v) = \sup\{v_n \mid n \geq 0\}$ ; (reachability)
- $\text{LimSup}(v) = \limsup_{n \rightarrow \infty} v_n = \lim_{n \rightarrow \infty} \sup\{v_i \mid i \geq n\}$ ; (Büchi)
- $\text{LimInf}(v) = \liminf_{n \rightarrow \infty} v_n = \lim_{n \rightarrow \infty} \inf\{v_i \mid i \geq n\}$ ; (coBüchi)

# Some value functions

---

For  $v = v_0v_1 \dots$  ( $v_i \in \mathbb{Q}$ ), let

( $v_i \in \{0,1\}$ )

- $\text{Sup}(v) = \sup\{v_n \mid n \geq 0\}$ ; (reachability)
- $\text{LimSup}(v) = \limsup_{n \rightarrow \infty} v_n = \lim_{n \rightarrow \infty} \sup\{v_i \mid i \geq n\}$ ; (Büchi)
- $\text{LimInf}(v) = \liminf_{n \rightarrow \infty} v_n = \lim_{n \rightarrow \infty} \inf\{v_i \mid i \geq n\}$ ; (coBüchi)
- $\text{LimAvg}(v) = \liminf_{n \rightarrow \infty} \frac{1}{n} \cdot \sum_{i=0}^{n-1} v_i$ ;
- given  $0 < \lambda < 1$ ,  $\text{Disc}_\lambda(v) = \sum_{i=0}^{\infty} \lambda^i \cdot v_i$ .

# Outline

---

- Motivation
- Weighted automata
- **Decision problems**
- Expressive power
- Closure properties

# Emptiness

---

Given  $\nu \in \mathbb{Q}$ , is  $L_A(w) \geq \nu$  for some word  $w$  ?

- solved by finding the maximal value of an infinite path in the graph of  $A$ ,
- memoryless strategies exist in the corresponding quantitative 1-player games,
- decidable in polynomial time for Sup, LimSup, LimInf, LimAvg and  $\text{Disc}_\lambda$ .

# Language Inclusion

---

Is  $L_A(w) \leq L_B(w)$  for all words  $w$  ?

- PSPACE-complete for Sup, LimSup and LimInf.
- Solvable in polynomial-time when **B** is deterministic for LimAvg and  $\text{Disc}_\lambda$ ,
- open question for nondeterministic automata.

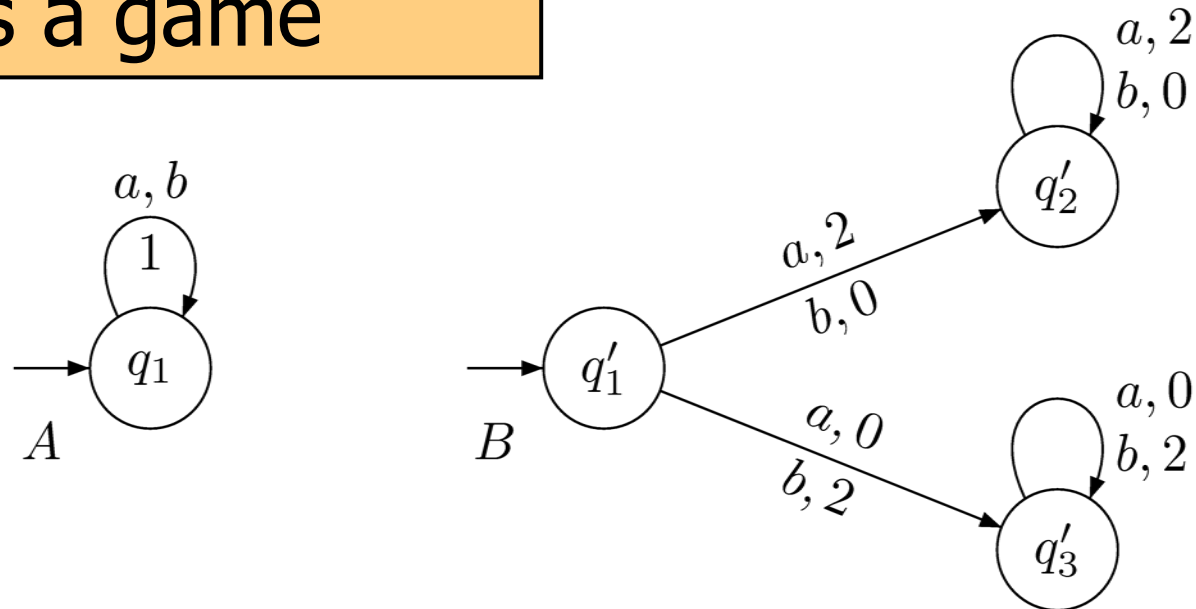
# Language Inclusion

---

	Quant. L. inclusion	
Sup	PSpace	
LimSup	PSpace	
LimInf	PSpace	
LimAvg	?	
Disc $_{\lambda}$	?	

# Language-inclusion game

Language inclusion  
as a game



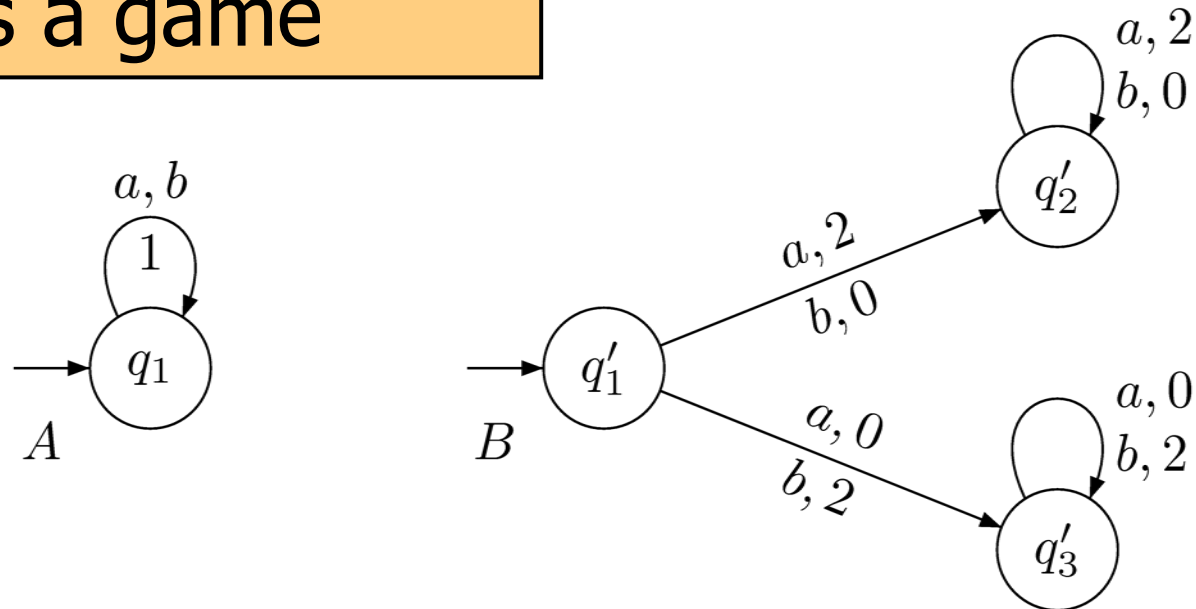
Discounted-sum automata,  $\lambda=3/4$

Is  $L_A(w) \leq L_B(w)$  for all words  $w$  ?



# Language-inclusion game

Language inclusion  
as a game



Discounted-sum automata,  $\lambda=3/4$

Is  $L_A(w) \leq L_B(w)$  for all words  $w$  ?

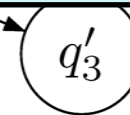
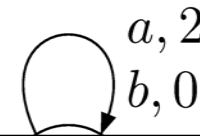
Yes !

# Language-inclusion game

---

## Language inclusion as a game

- turn-based, two players;
- Challenger wins iff  $\exists w : L_A(w) > L_B(w)$ .



Is  $L_A(w) \leq L_B(w)$  for all words  $w$  ?

# Language-inclusion game

## Language inclusion as a game

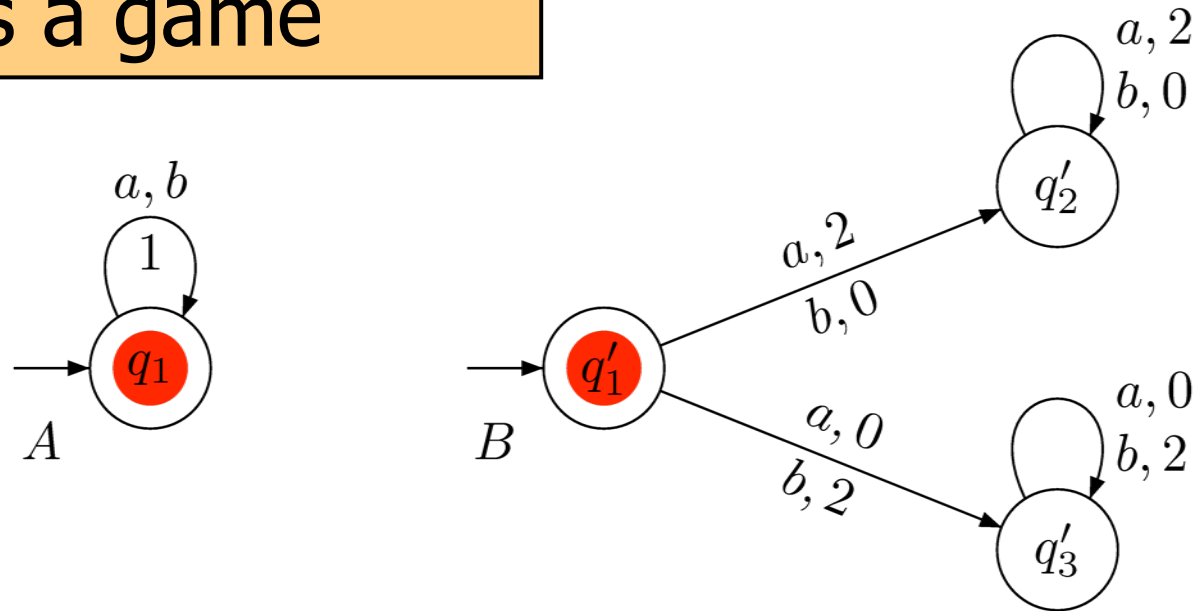
- turn-based, two players;
- Challenger wins iff  $\exists w : L_A(w) > L_B(w)$ .

winning strategy

Is  $L_A(w) \leq L_B(w)$  for all words  $w$  ?

# Language-inclusion game

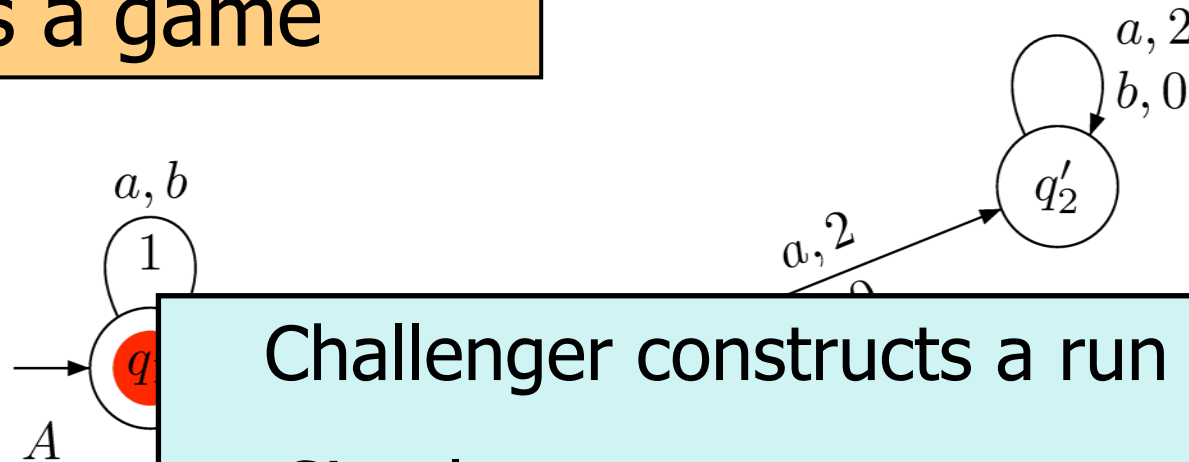
Language inclusion  
as a game



Tokens on the initial states

# Language-inclusion game

Language inclusion  
as a game



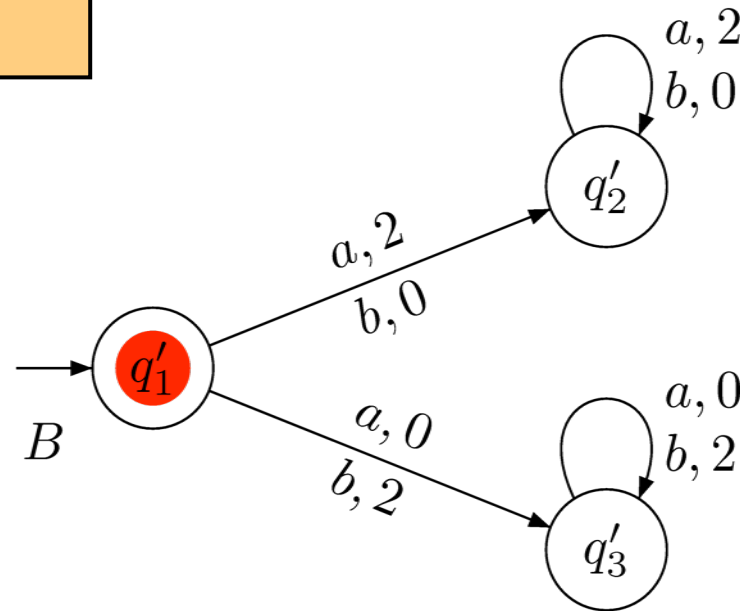
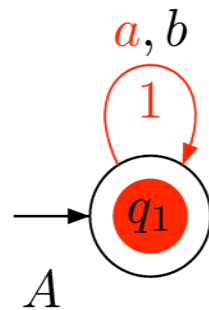
Challenger constructs a run  $r_1$  of  $A$ ,  
Simulator constructs a run  $r_2$  of  $B$ .  
Challenger wins if  $\text{Val}(r_1) > \text{Val}(r_2)$ .

Challenger:  $q_1$

Simulator:  $q'_1$

# Language-inclusion game

Language inclusion  
as a game

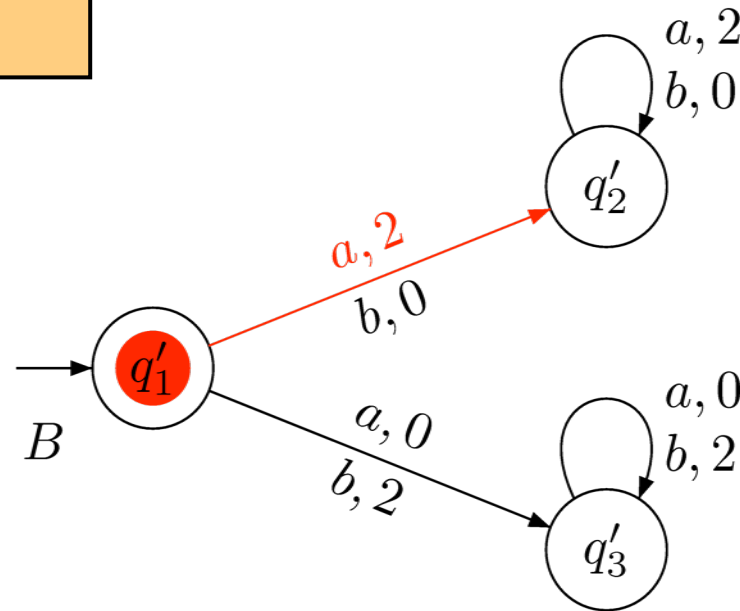
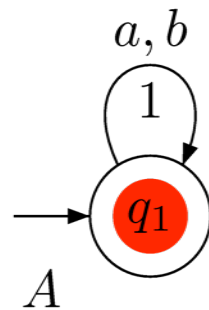


Challenger:  $q_1 \xrightarrow[1]{a} q_1$

Simulator:  $q'_1$

# Language-inclusion game

Language inclusion  
as a game

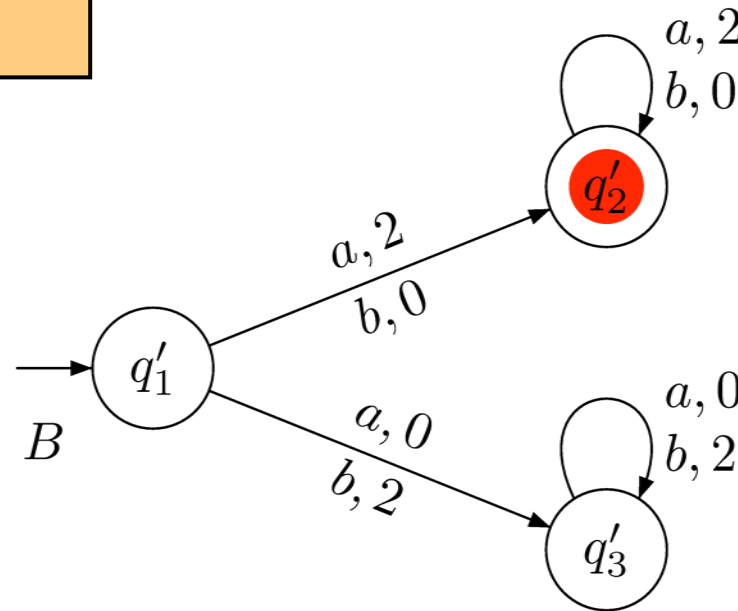
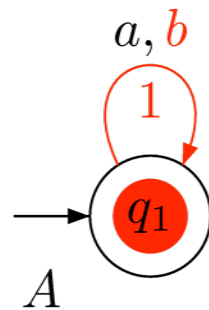


Challenger:  $q_1 \xrightarrow[1]{a} q_1$

Simulator:  $q'_1 \xrightarrow[2]{a} q'_2$

# Language-inclusion game

Language inclusion  
as a game



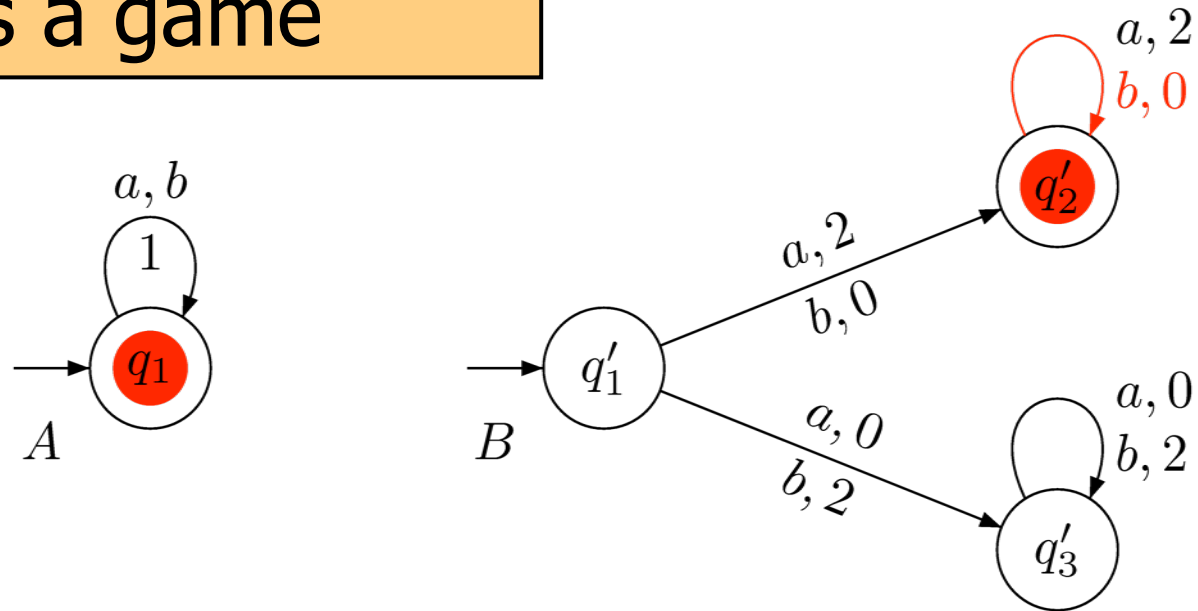
Challenger:  $q_1 \xrightarrow[1]{a} q_1 \xrightarrow[1]{b} q_1$

Simulator:  $q'_1 \xrightarrow[2]{a} q'_2$



# Language-inclusion game

Language inclusion  
as a game

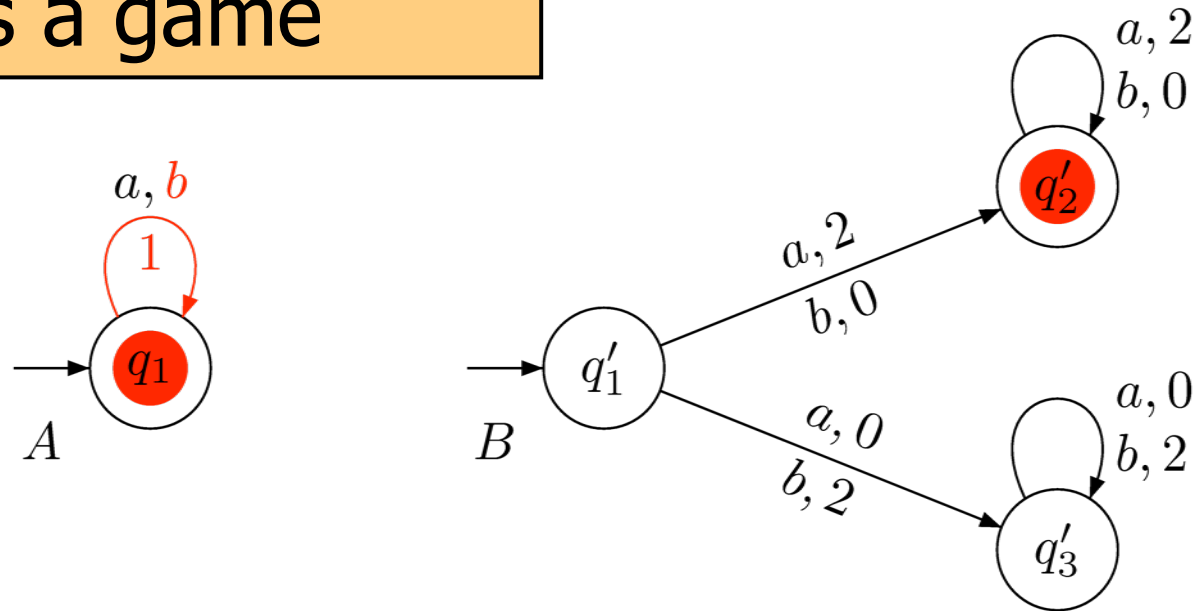


Challenger:  $q_1 \xrightarrow[a]{1} q_1 \xrightarrow[b]{1} q_1$

Simulator:  $q'_1 \xrightarrow[a]{2} q'_2 \xrightarrow[b]{0} q'_2$

# Language-inclusion game

Language inclusion  
as a game

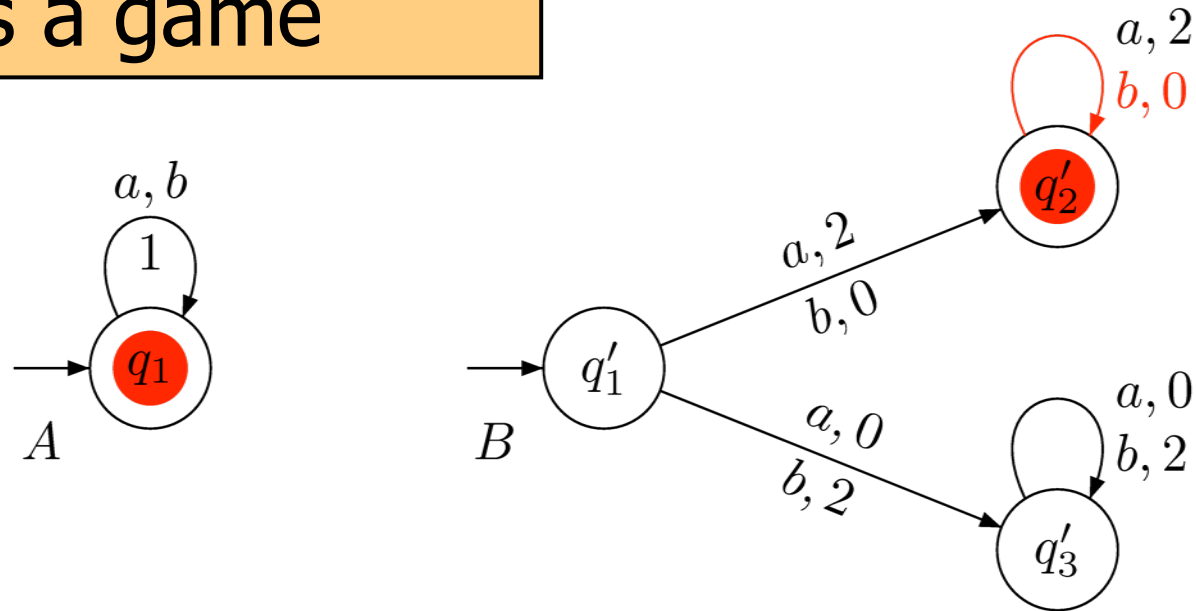


Challenger:  $q_1 \xrightarrow[1]{a} q_1 \xrightarrow[1]{b} q_1 \xrightarrow[1]{b} \dots$

Simulator:  $q'_1 \xrightarrow[2]{a} q'_2 \xrightarrow[0]{b} q'_2$

# Language-inclusion game

Language inclusion  
as a game

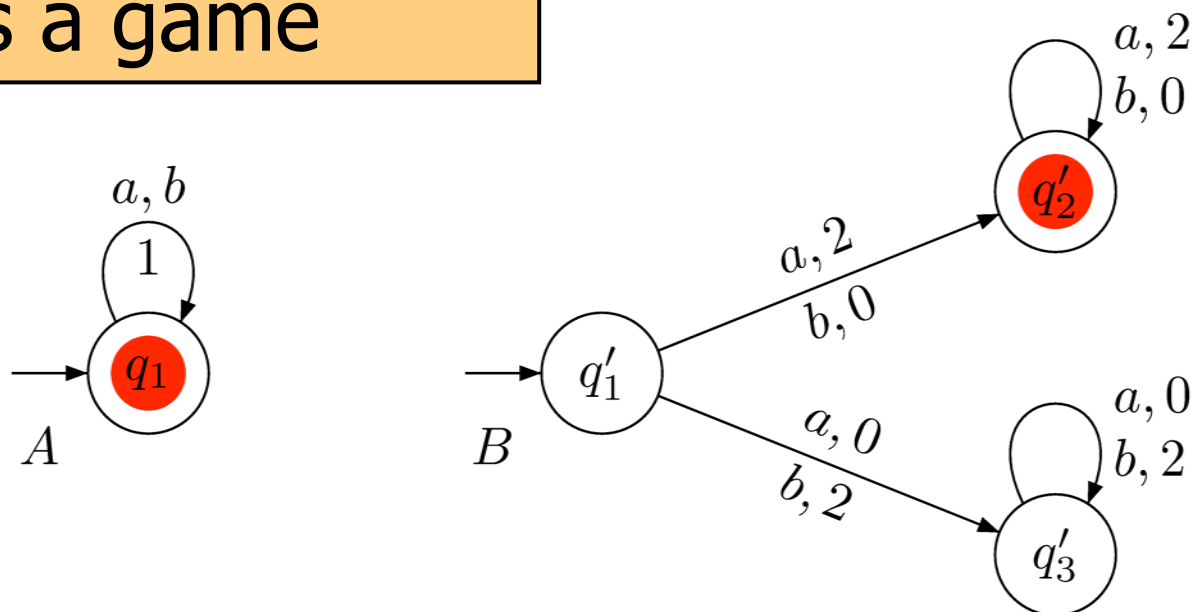


Challenger:  $q_1 \xrightarrow[a]{1} q_1 \xrightarrow[b]{1} q_1 \xrightarrow[b]{1} \dots$

Simulator:  $q'_1 \xrightarrow[a]{2} q'_2 \xrightarrow[b]{0} q'_2 \xrightarrow[b]{0} \dots$

# Language-inclusion game

Language inclusion  
as a game

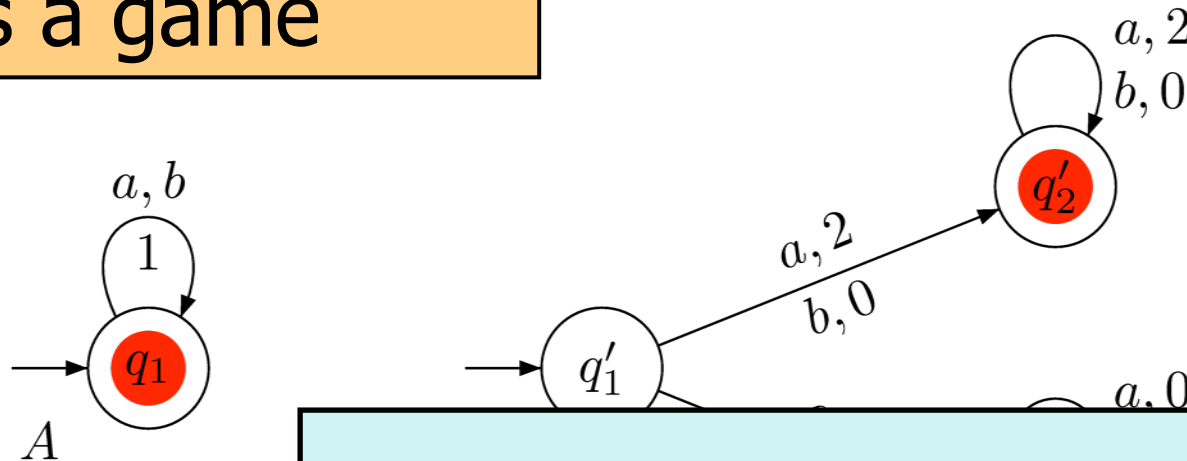


Challenger:  $q_1 \xrightarrow[1]{a} q_1 \xrightarrow[1]{b} q_1 \xrightarrow[1]{b} \dots$        $\text{Disc}_{\frac{3}{4}}(1, 1, 1, \dots) = \frac{1}{1 - \frac{3}{4}} = 4.$

Simulator:  $q'_1 \xrightarrow[2]{a} q'_2 \xrightarrow[0]{b} q'_2 \xrightarrow[0]{b} \dots$        $\text{Disc}_{\frac{3}{4}}(2, 0, 0, \dots) = 2.$

# Language-inclusion game

Language inclusion  
as a game



Challenger wins since  $4 > 2$ .

Challenger:  $q_1 \xrightarrow[1]{a}$  However,  $L_A(w) \leq L_B(w)$  for all  $w$ .

Simulator:  $q_1' \xrightarrow[2]{a} q_2' \xrightarrow[0]{a} q_2' \xrightarrow[0]{a} \dots$   $\text{DISC}_{\frac{3}{4}}(z, 0, 0, \dots) = z$ .

# Language-inclusion game

---

The game is **blind** if the Challenger **cannot observe** the state of the Simulator.

Challenger has no winning strategy in the blind game  
if and only if

$$L_A(w) \leq L_B(w) \text{ for all words } w.$$

# Language-inclusion game

---

The game is **blind** if the Challenger **cannot observe** the state of the Simulator.

Challenger has no winning strategy in the blind game  
if and only if

$$L_A(w) \leq L_B(w) \text{ for all words } w.$$

When the game is **not blind**, we say that **B simulates A** if the Challenger has no winning strategy.

Simulation implies language inclusion.

# Simulation is decidable

---

	Quant. L. inclusion	Quant. simulation	(Reduction to)
Sup	PSPACE	P	(weak parity)
LimSup	PSPACE	$NP \cap coNP$	(parity)
LimInf	PSPACE	$NP \cap coNP$	(parity)
LimAvg	?	$NP \cap coNP$	(mean payoff)
Disc $_{\lambda}$	?	$NP \cap coNP$	(discounted sum)



# Universality and Equivalence

---

Universality problem:

Given  $\nu \in \mathbb{Q}$ , is  $L_A(w) \geq \nu$  for all words  $w$  ?

Language equivalence problem:

Is  $L_A(w) = L_B(w)$  for all words  $w$  ?

Complexity/decidability: same situation as Language inclusion.

# Outline

---

- Motivation
- Weighted automata
- Decision problems
- Expressive power
- Closure properties

# Reducibility

---

A class  $C$  of weighted automata **can be reduced** to a class  $C'$  of weighted automata if

for all  $A \in C$ , there is  $A' \in C'$  such that  $L_A = L_{A'}$ .

# Reducibility

---

A class  $C$  of weighted automata **can be reduced** to a class  $C'$  of weighted automata if

for all  $A \in C$ , there is  $A' \in C'$  such that  $L_A = L_{A'}$ .

E.g. for boolean languages:

- Nondet. coBüchi can be reduced to nondet. Büchi
- Nondet. Büchi cannot be reduced to det. Büchi  
(nondet. Büchi cannot be **determinized**)

# Some easy facts

---

$\text{Disc}_\lambda$  and  $\text{LimAvg}$  can define quantitative languages with infinite range,  $\text{Sup}$ ,  $\text{LimInf}$  and  $\text{LimSup}$  cannot.

$\text{Disc}_\lambda$  and  $\text{LimAvg}$  cannot be reduced to  $\text{Sup}$ ,  $\text{LimInf}$  and  $\text{LimSup}$ .

# Some easy facts

---

For discounted-sum, **prefixes** provide good approximations of the value.

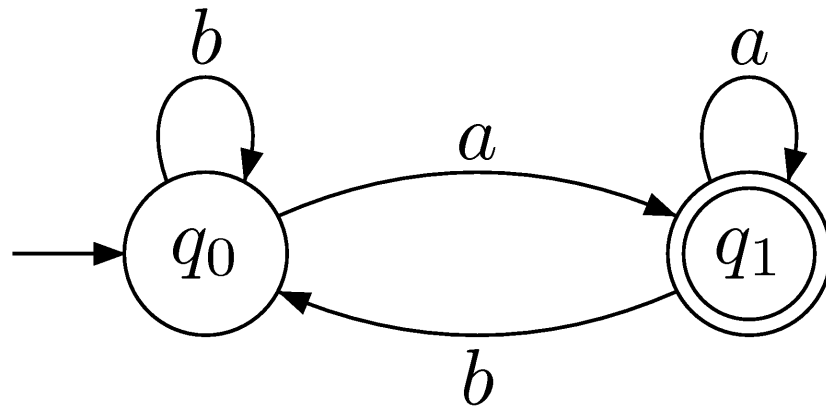
For LimSup, LimInf and LimAvg, **suffixes** determine the value.

$\text{Disc}_\lambda$  cannot be reduced to LimInf, LimSup and LimAvg.

LimInf, LimSup and LimAvg cannot be reduced to  $\text{Disc}_\lambda$ .

# Büchi does not reduce to LimAvg

---



$$L_1 = (\Sigma^* \cdot a)^\omega$$

“infinitely many  $a$ ”

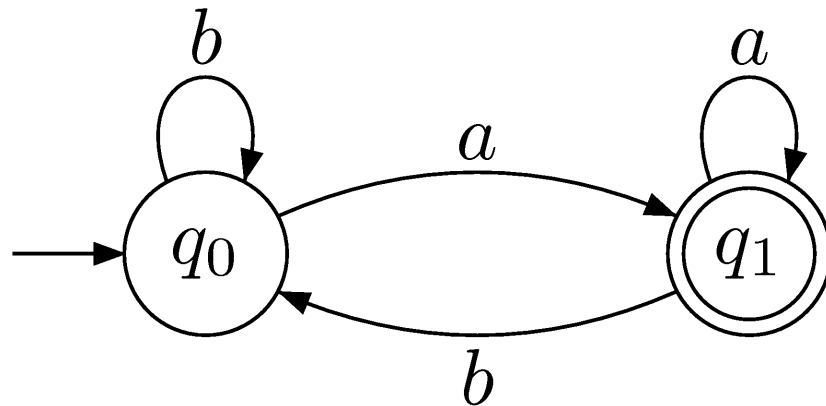
Deterministic Büchi automaton

Assume that  $L_1$  is definable by a LimAvg automaton  $A$ .

Then, **all**  $b$ -cycles in  $A$  have average weight  $\leq 0$ .

# Büchi does not reduce to LimAvg

---



$$L_1 = (\Sigma^* \cdot a)^\omega$$

“infinitely many  $a$ ”

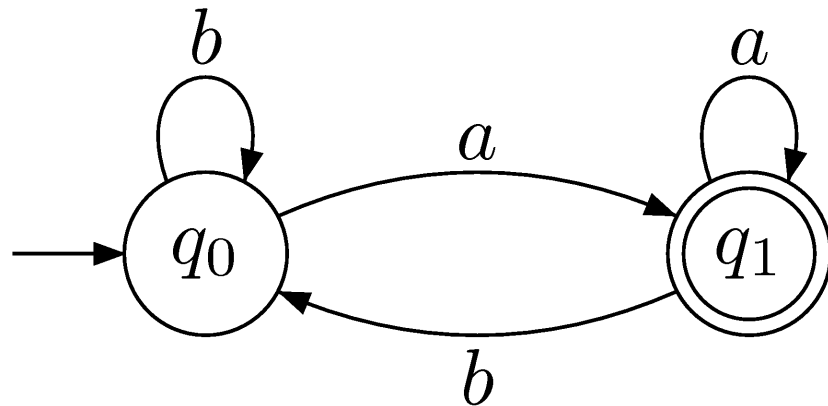
Deterministic Büchi automaton

Hence, the maximal average weight of a run over any word in  $\Sigma^* \cdot b^n$  tends to (at most) 0 when  $n \rightarrow \infty$ .



# Büchi does not reduce to LimAvg

---



$$L_1 = (\Sigma^* \cdot a)^\omega$$

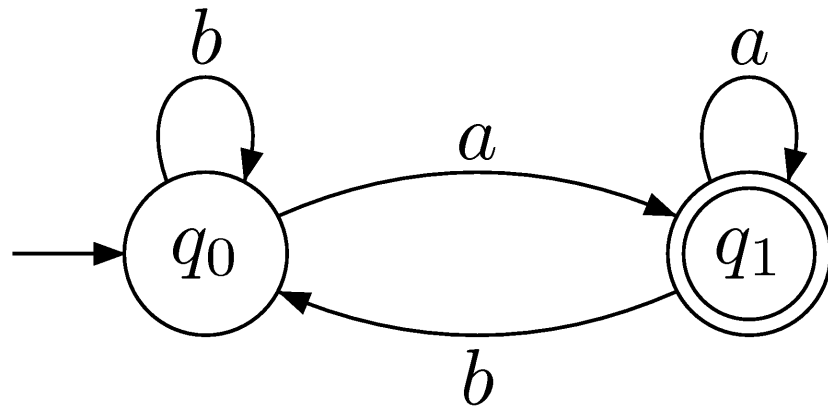
“infinitely many  $a$ ”

Deterministic Büchi automaton

Let  $w_n = (a \cdot b^n)^\omega$       We have  $L_1(w_n) = 1$

$w_n = \underbrace{a \cdot b \cdots b}_{v_n} \cdot \underbrace{a \cdot b \cdots b}_{v_n} \cdots$  where  $v_n \leq \varepsilon$  for sufficiently large  $n$ .

# Büchi does not reduce to LimAvg



$$L_1 = (\Sigma^* \cdot a)^\omega$$

“infinitely many  $a$ ”

Deterministic Büchi automaton

Let  $w_n = (a \cdot b^n)^\omega$       We have  $L_1(w_n) = 1$

$$w_n = \underbrace{a \cdot b \cdots b}_{v_n} \cdot a$$

Hence,  $\text{LimAvg}(w_n) = 0 \neq 1$ .

and  $A$  cannot exist !

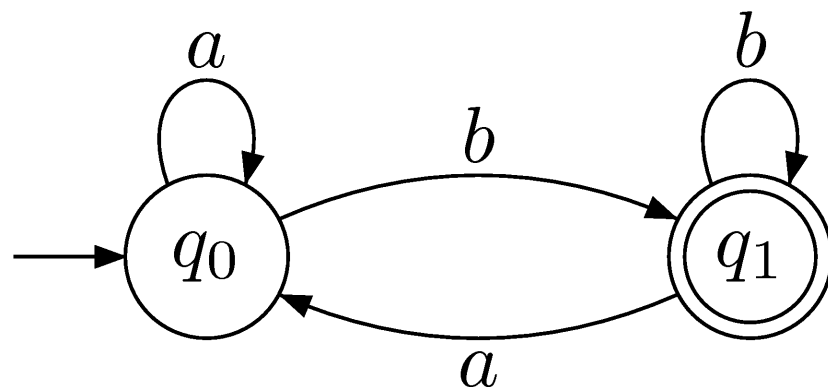
# (co)Büchi and LimAvg

---

det. Büchi cannot be reduced to LimAvg.

By analogous arguments,

det. coBüchi cannot be reduced to det. LimAvg.



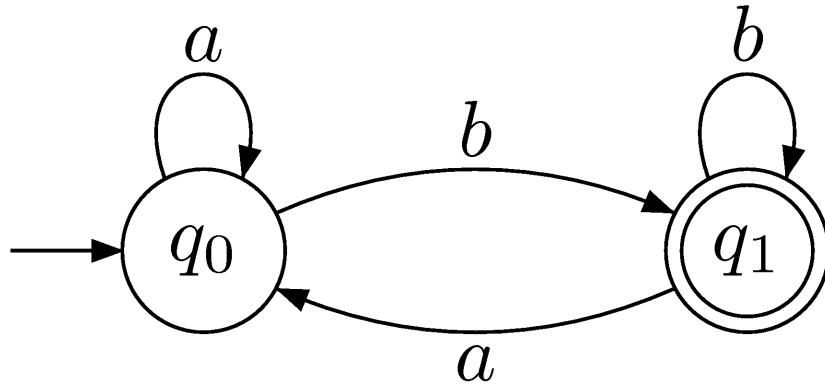
$$L_2 = \Sigma^* \cdot b^\omega$$

“finitely many  $a$ ”

Deterministic coBüchi automaton

# (co)Büchi and LimAvg

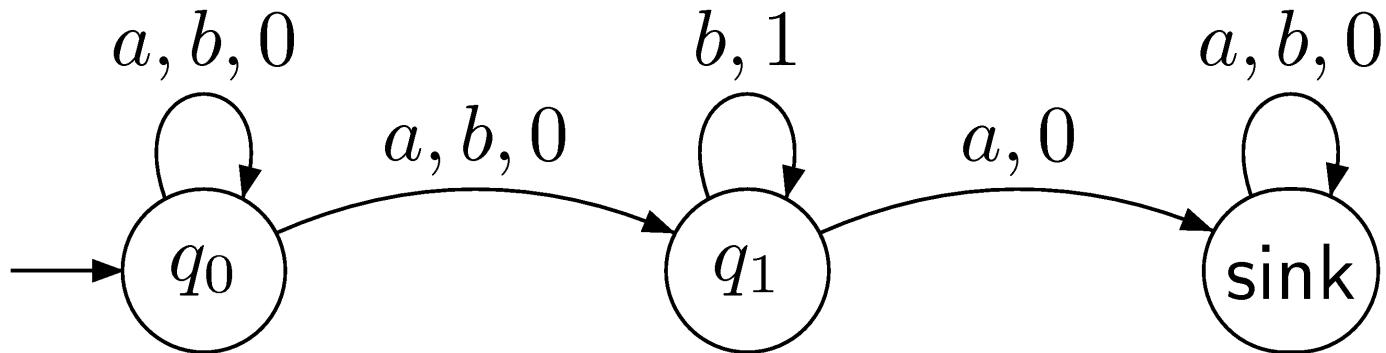
---



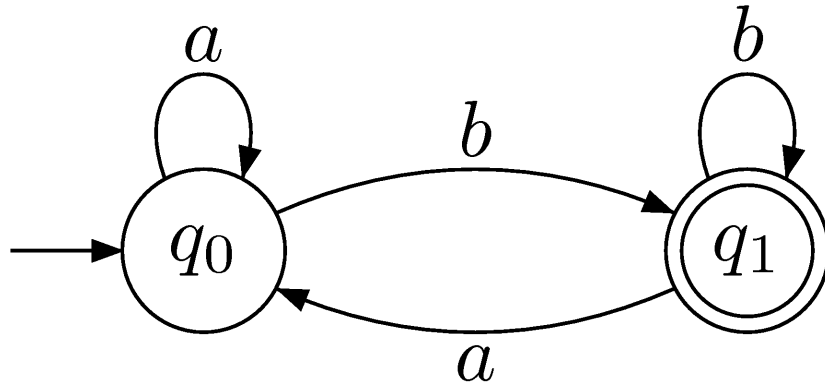
Det. coBüchi automaton

$$L_2 = \Sigma^* \cdot b^\omega$$

$L_2$  is defined by the following nondet. LimAvg automaton:



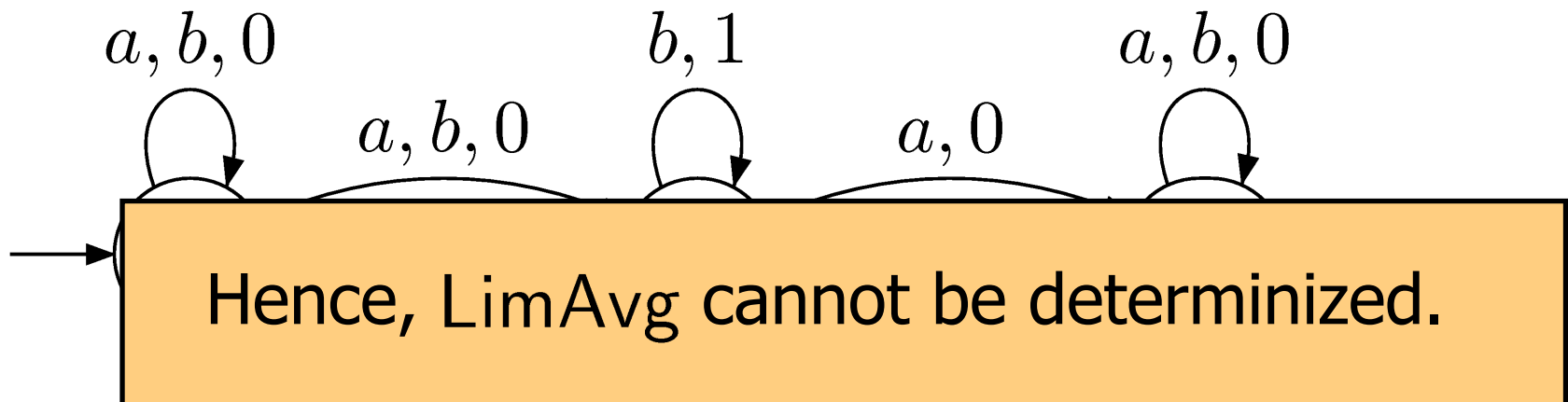
# (co)Büchi and LimAvg



Det. coBüchi automaton

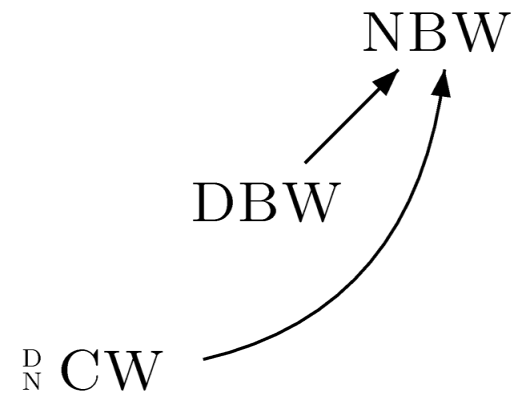
$$L_2 = \Sigma^* \cdot b^\omega$$

$L_2$  is defined by the following nondet. LimAvg automaton:



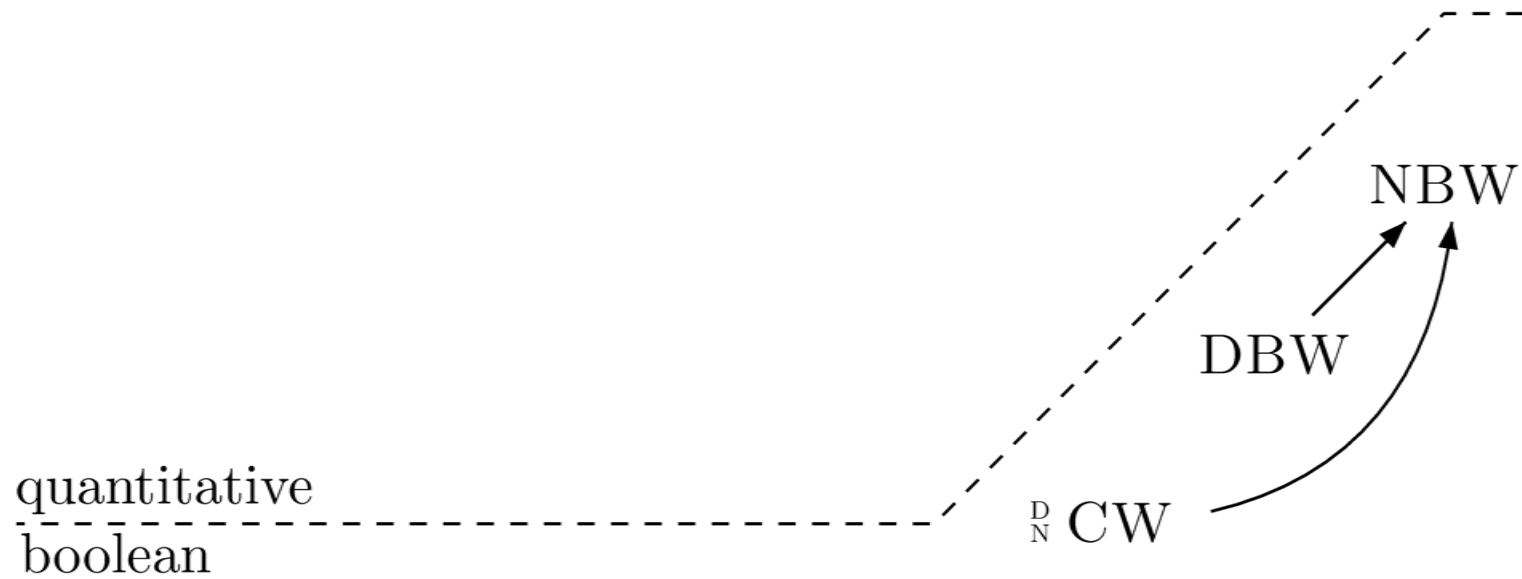
# Reducibility relations

---



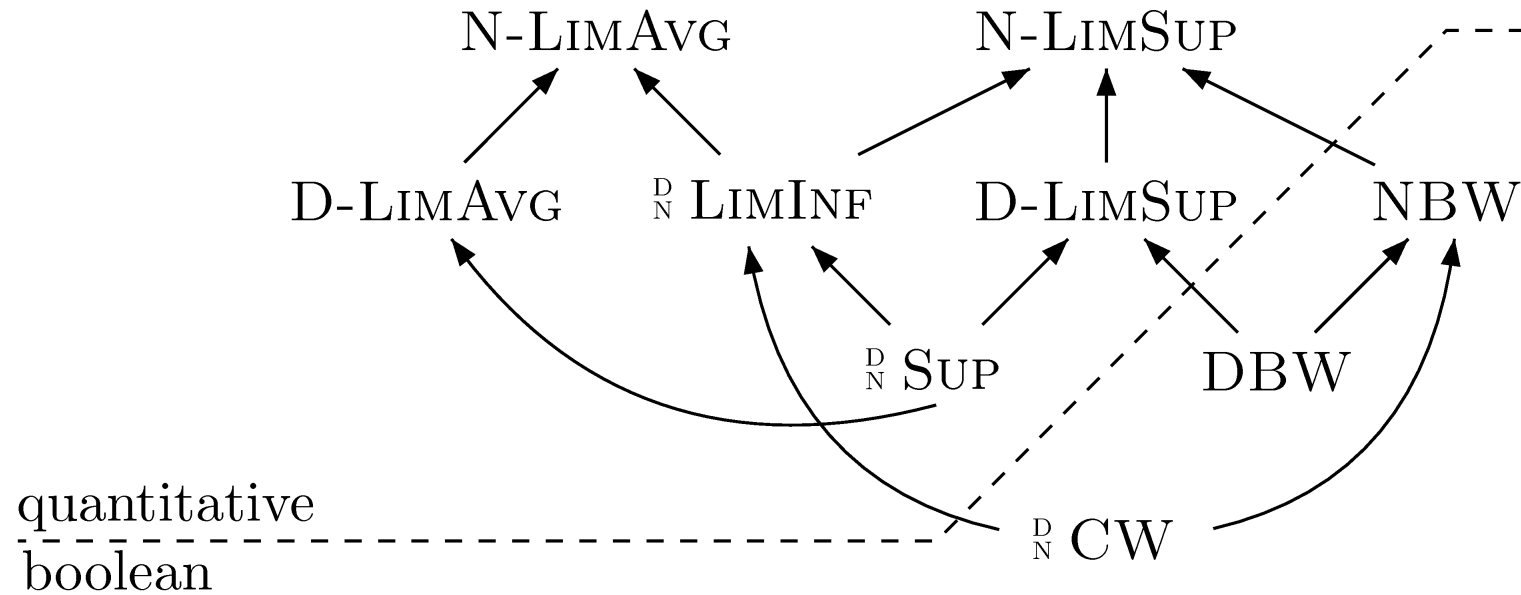
# Reducibility relations

---



# Reducibility relations

---



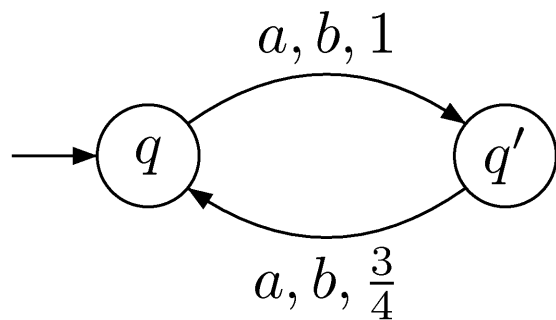


# Expressive power of $\{0,1\}$ -automata

---

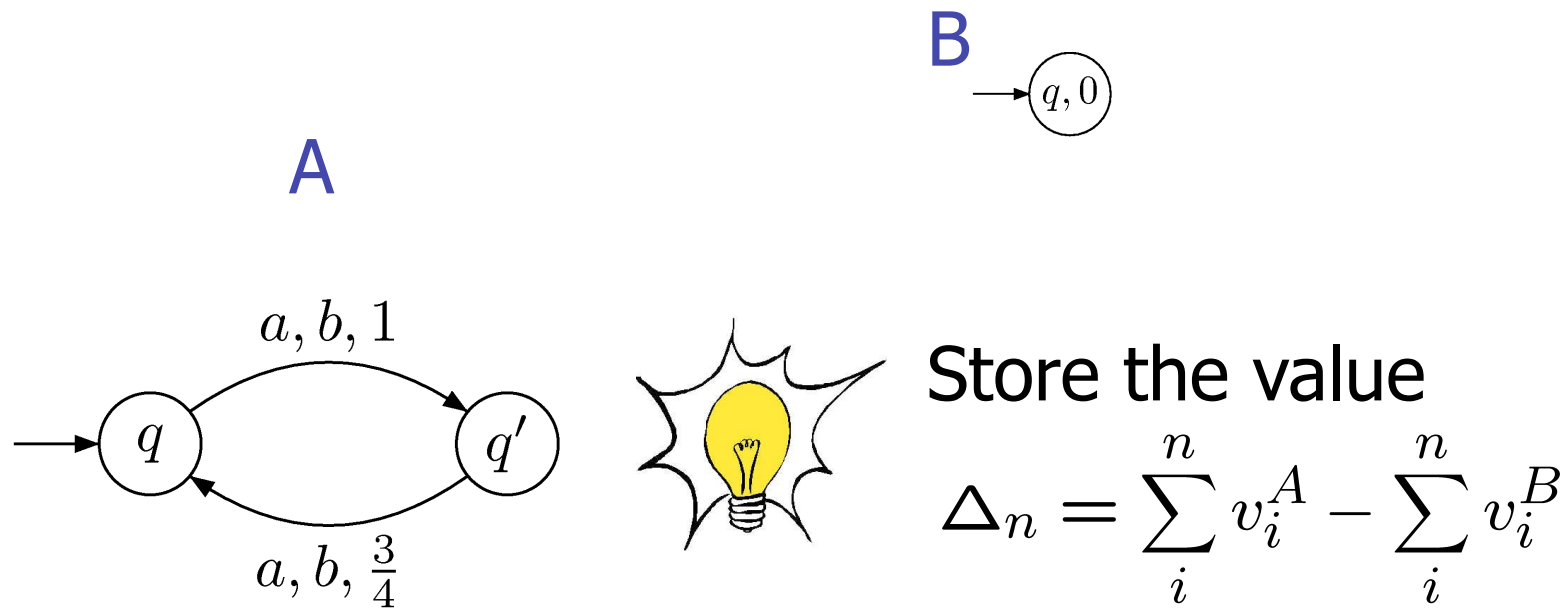
$\text{LimAvg}_{[0,1]}$  is reducible to  $\text{LimAvg}_{\{0,1\}}$ .

$\text{Disc}_{[0,1]}$  is not reducible to  $\text{Disc}_{\{0,1\}}$ .



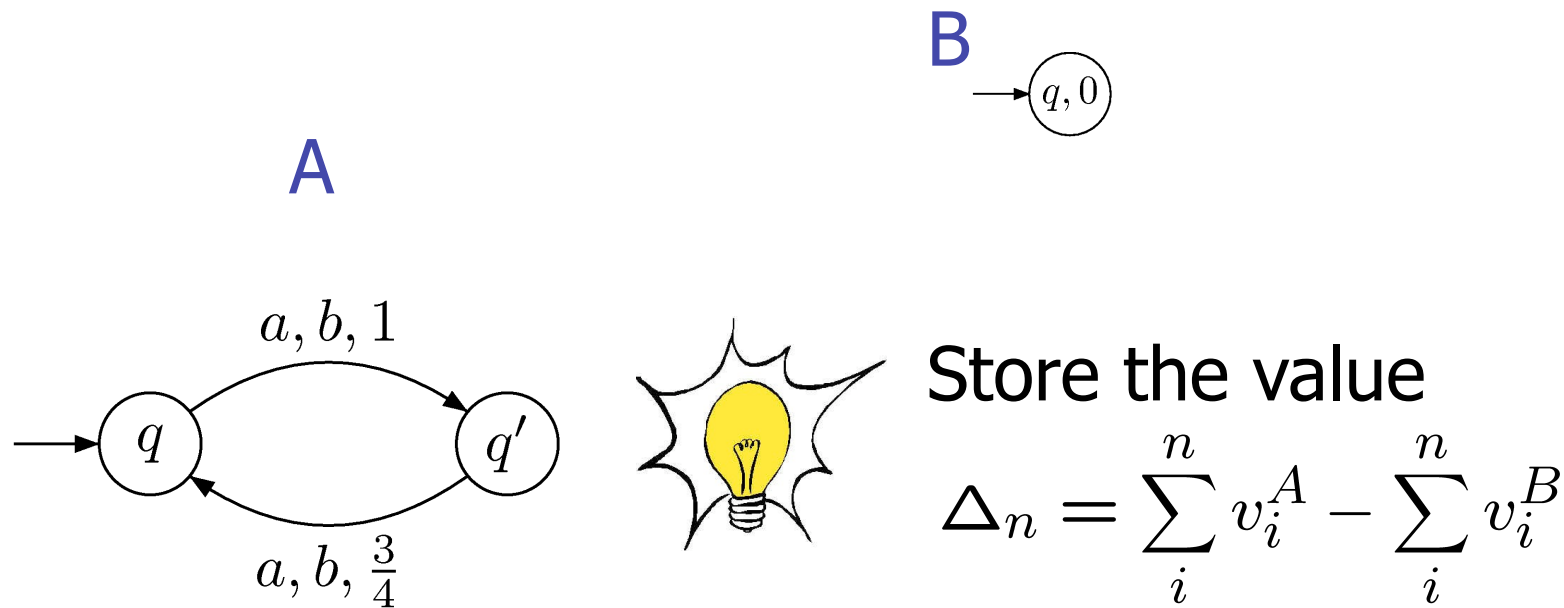
# Expressive power of $\{0,1\}$ -automata

$\text{LimAvg}_{[0,1]}$  is reducible to  $\text{LimAvg}_{\{0,1\}}$ .



# Expressive power of $\{0,1\}$ -automata

LimAvg $_{[0,1]}$  is reducible to LimAvg $_{\{0,1\}}$ .



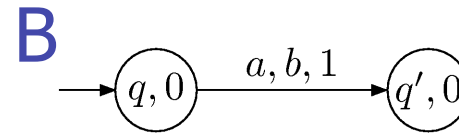
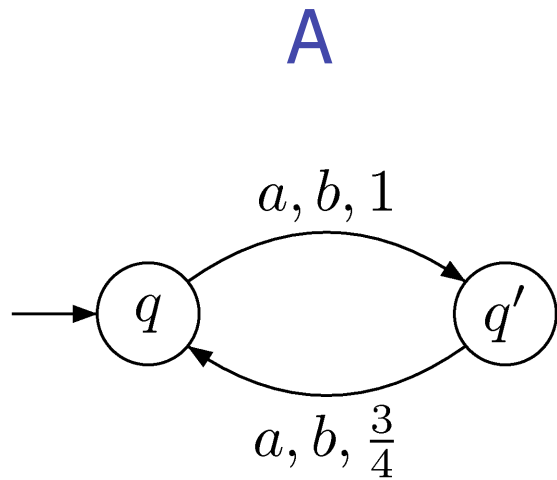
Key:  $\Delta_n$  can take finitely many different values.

in the example,  $\Delta_n \in \{0, \frac{1}{4}, \frac{1}{2}, \frac{3}{4}\}$

# Expressive power of $\{0,1\}$ -automata

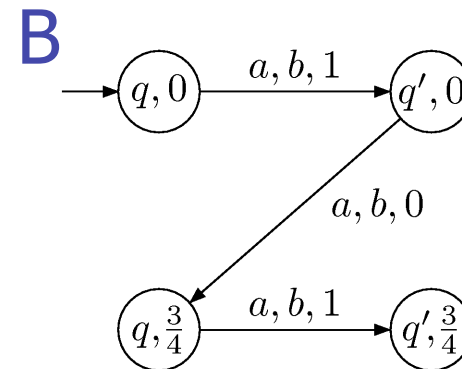
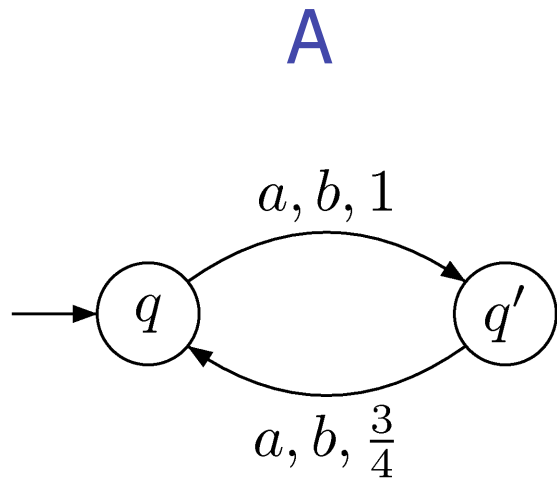
---

$\text{LimAvg}_{[0,1]}$  is reducible to  $\text{LimAvg}_{\{0,1\}}$ .



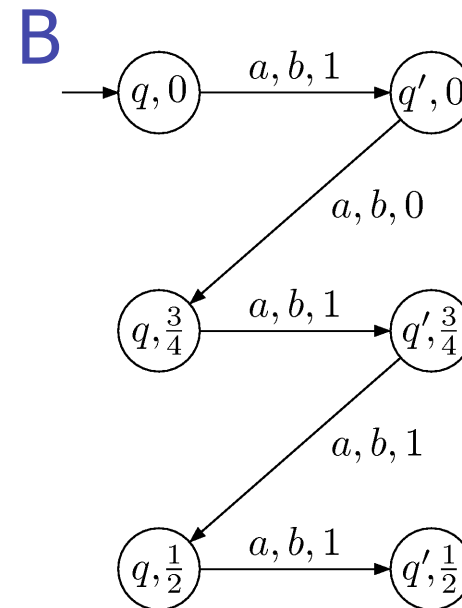
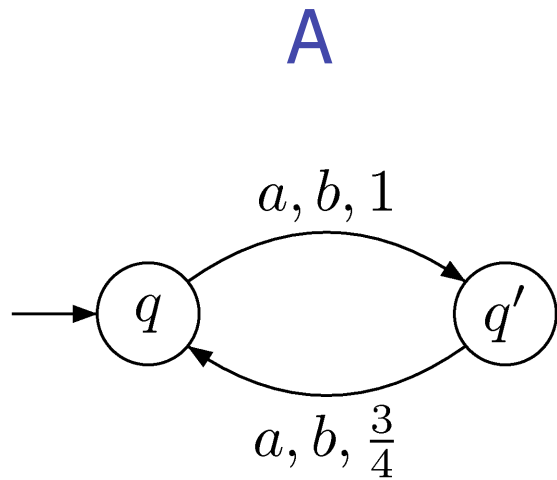
# Expressive power of $\{0,1\}$ -automata

$\text{LimAvg}_{[0,1]}$  is reducible to  $\text{LimAvg}_{\{0,1\}}$ .



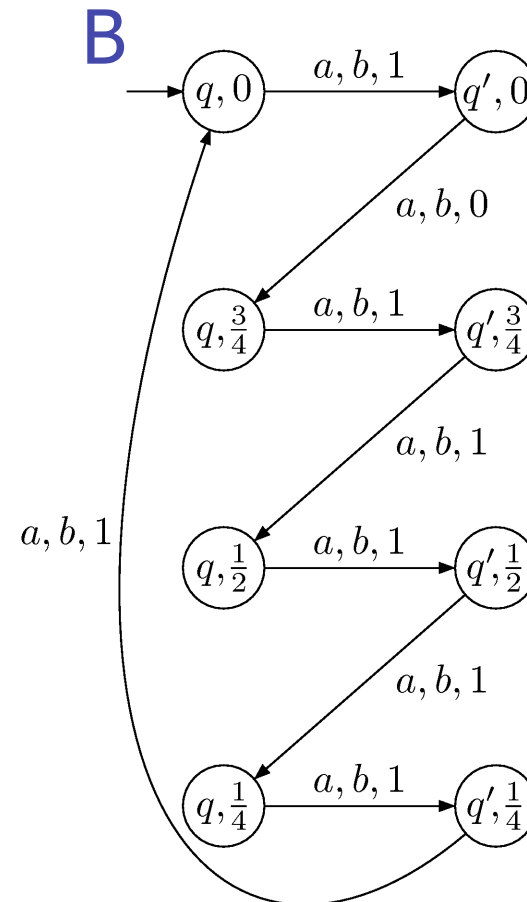
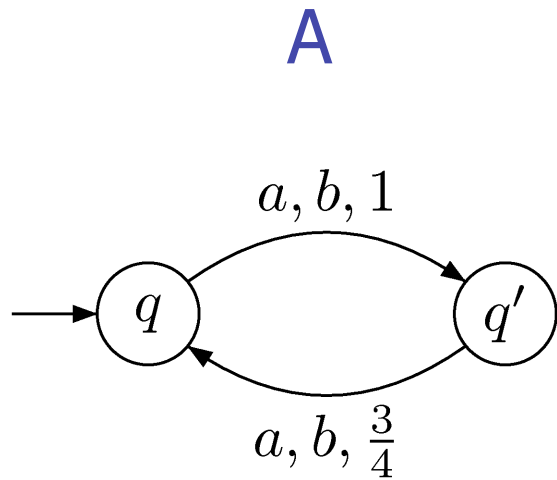
# Expressive power of $\{0,1\}$ -automata

$\text{LimAvg}_{[0,1]}$  is reducible to  $\text{LimAvg}_{\{0,1\}}$ .



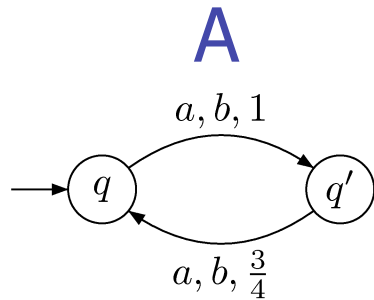
# Expressive power of $\{0,1\}$ -automata

$\text{LimAvg}_{[0,1]}$  is reducible to  $\text{LimAvg}_{\{0,1\}}$ .



# Expressive power of $\{0,1\}$ -automata

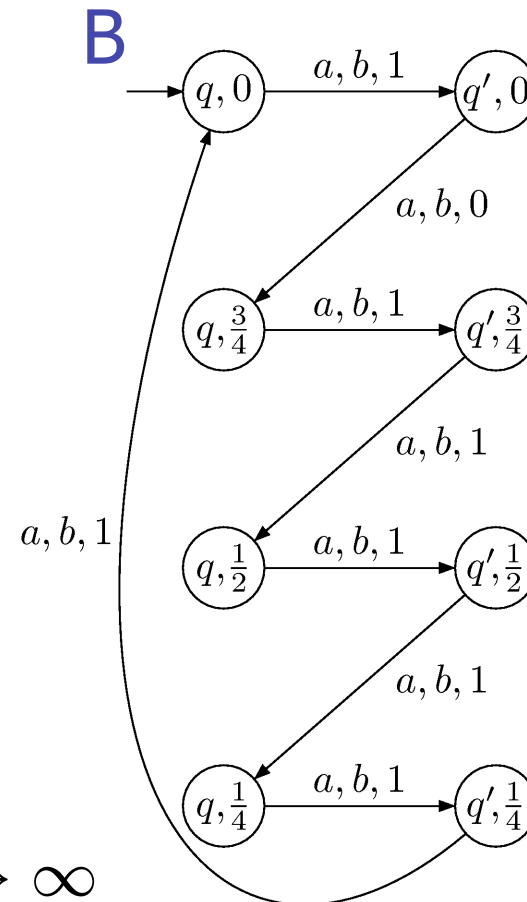
LimAvg $_{[0,1]}$  is reducible to LimAvg $_{\{0,1\}}$ .



$$\Delta_n = \sum_i^n v_i^A - \sum_i^n v_i^B$$

$0 \leq \Delta_n < 1$  for all  $n \geq 0$

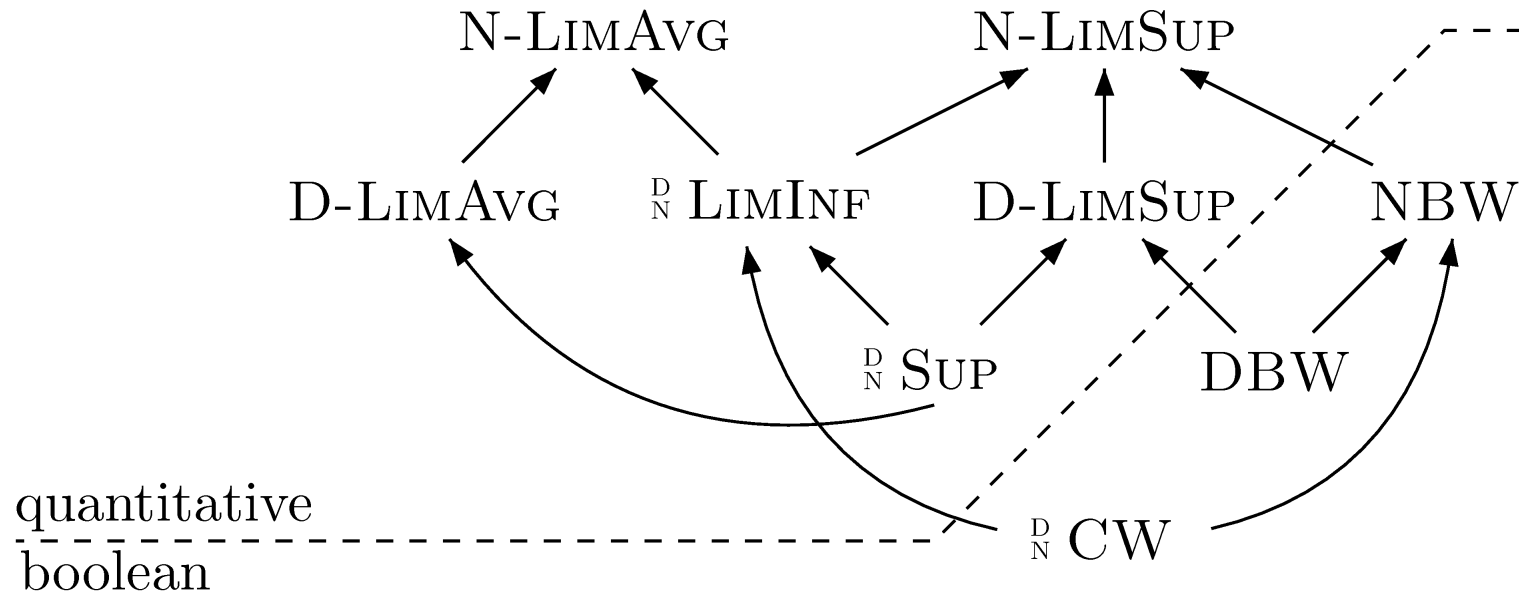
Therefore  $\frac{\Delta_n}{n} \rightarrow 0$  for  $n \rightarrow \infty$





# Reducibility relations

---

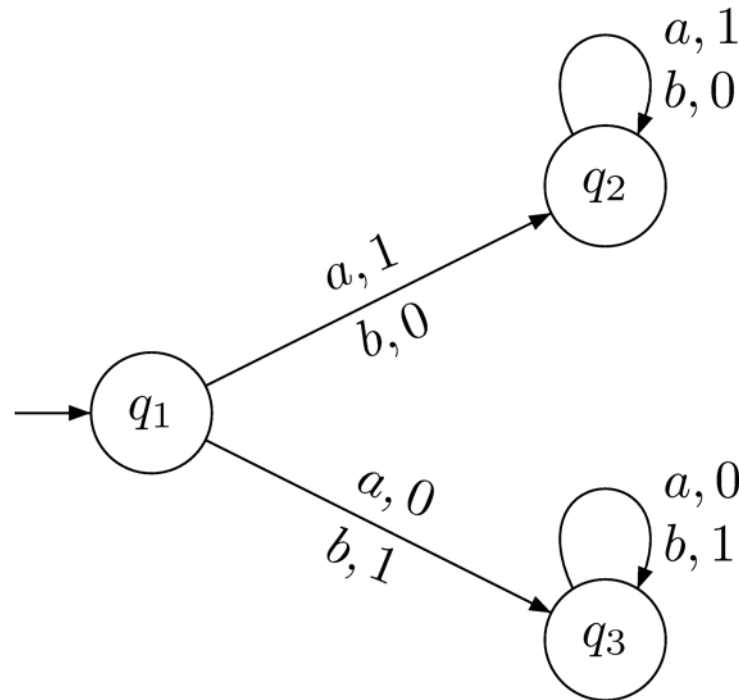


What about Discounted Sum ?

# Last result

---

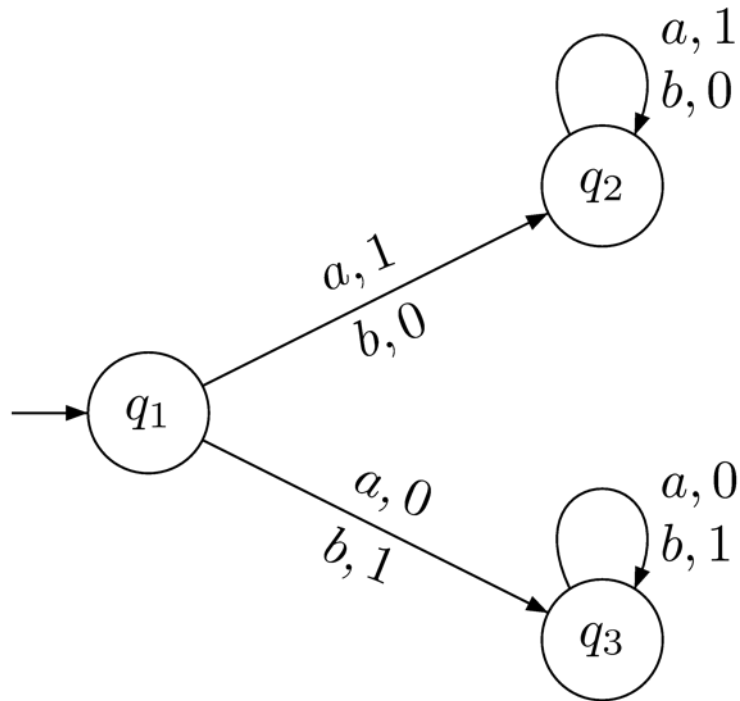
$\text{Disc}_\lambda$  cannot be determinized.



$$\lambda = 3/4$$

# Disc <sub>$\lambda$</sub> cannot be determinized

---



Value of a word  $w$  :

$$\max(v_a(w), v_b(w))$$

$$v_a(w) = \sum_{i|w_i=a}^{|w|} \lambda^i \quad \text{disc. sum of } a\text{'s}$$

$$v_b(w) = \sum_{i|w_i=b}^{|w|} \lambda^i \quad \text{disc. sum of } b\text{'s}$$

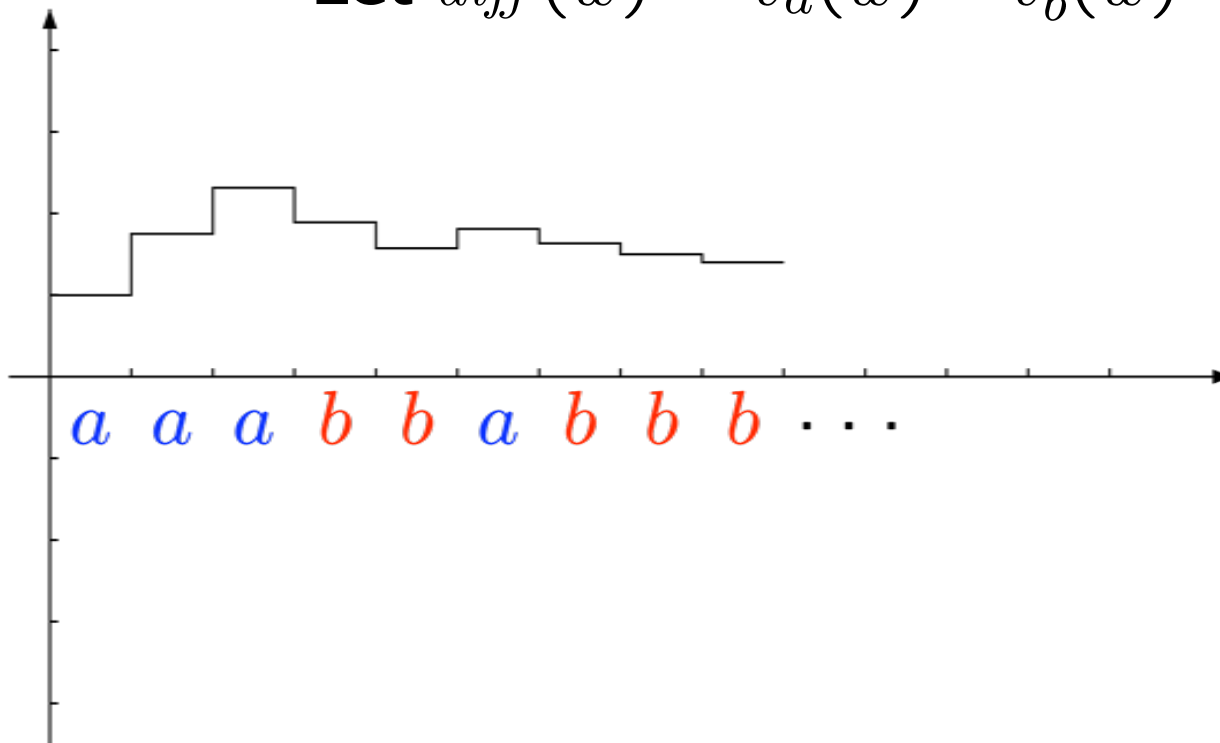
# Disc <sub>$\lambda$</sub> cannot be determinized

---

$$v_a(w) = \sum_{i|w_i=a}^{|w|} \lambda^i$$

$$v_b(w) = \sum_{i|w_i=b}^{|w|} \lambda^i$$

Let  $diff(w) = v_a(w) - v_b(w)$



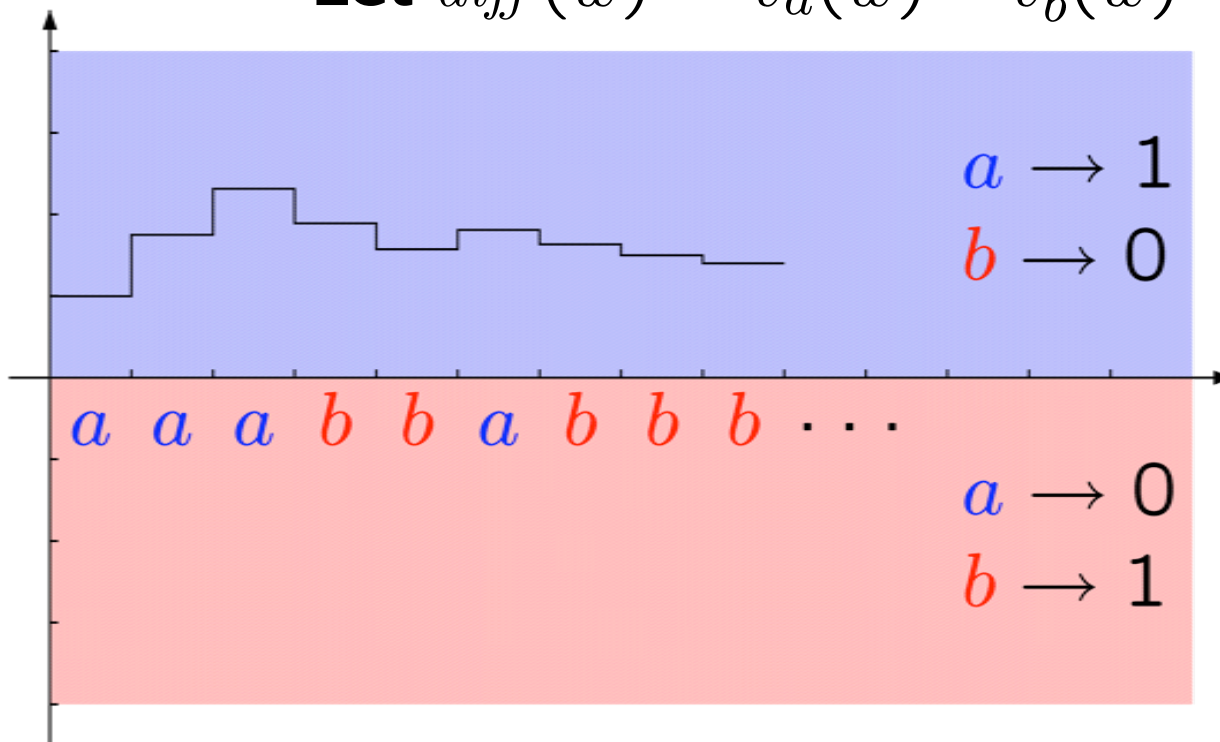
# Disc<sub>λ</sub> cannot be determinized

---

$$v_a(w) = \sum_{i|w_i=a} \lambda^i$$

$$v_b(w) = \sum_{i|w_i=b} \lambda^i$$

Let  $diff(w) = v_a(w) - v_b(w)$

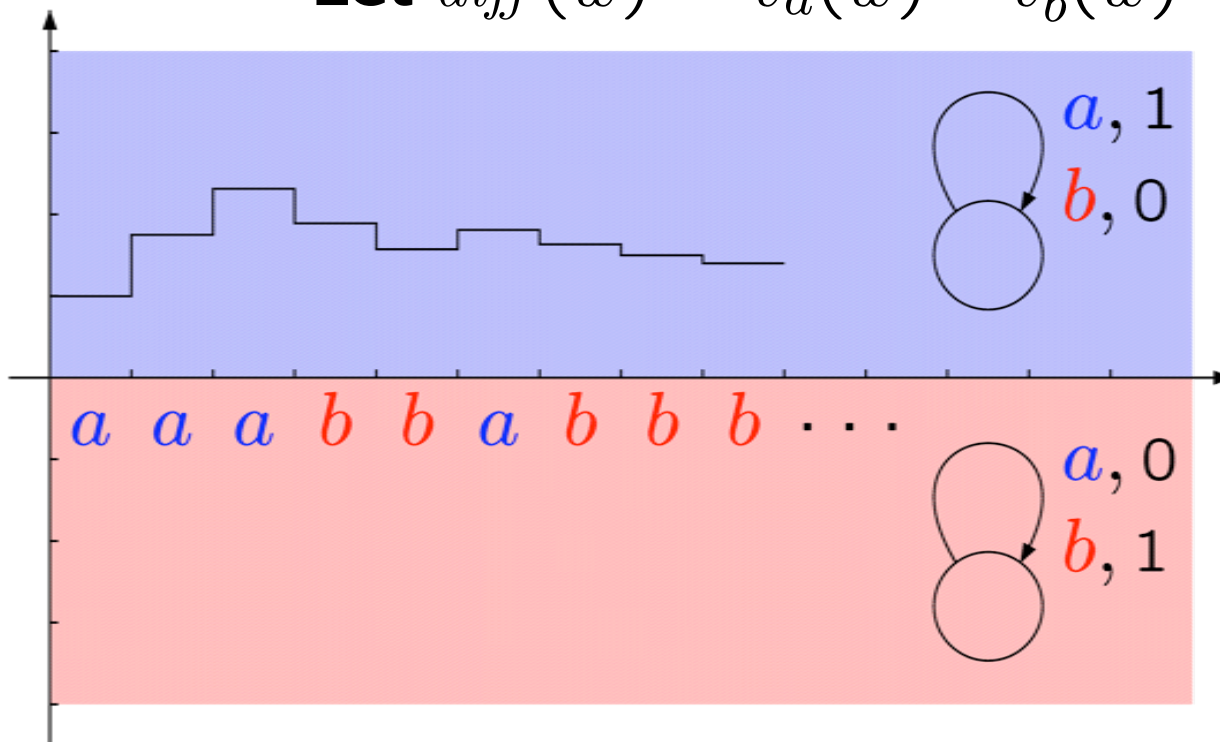


# Disc <sub>$\lambda$</sub> cannot be determinized

$$v_a(w) = \sum_{i|w_i=a}^{|w|} \lambda^i$$

$$v_b(w) = \sum_{i|w_i=b}^{|w|} \lambda^i$$

Let  $diff(w) = v_a(w) - v_b(w)$



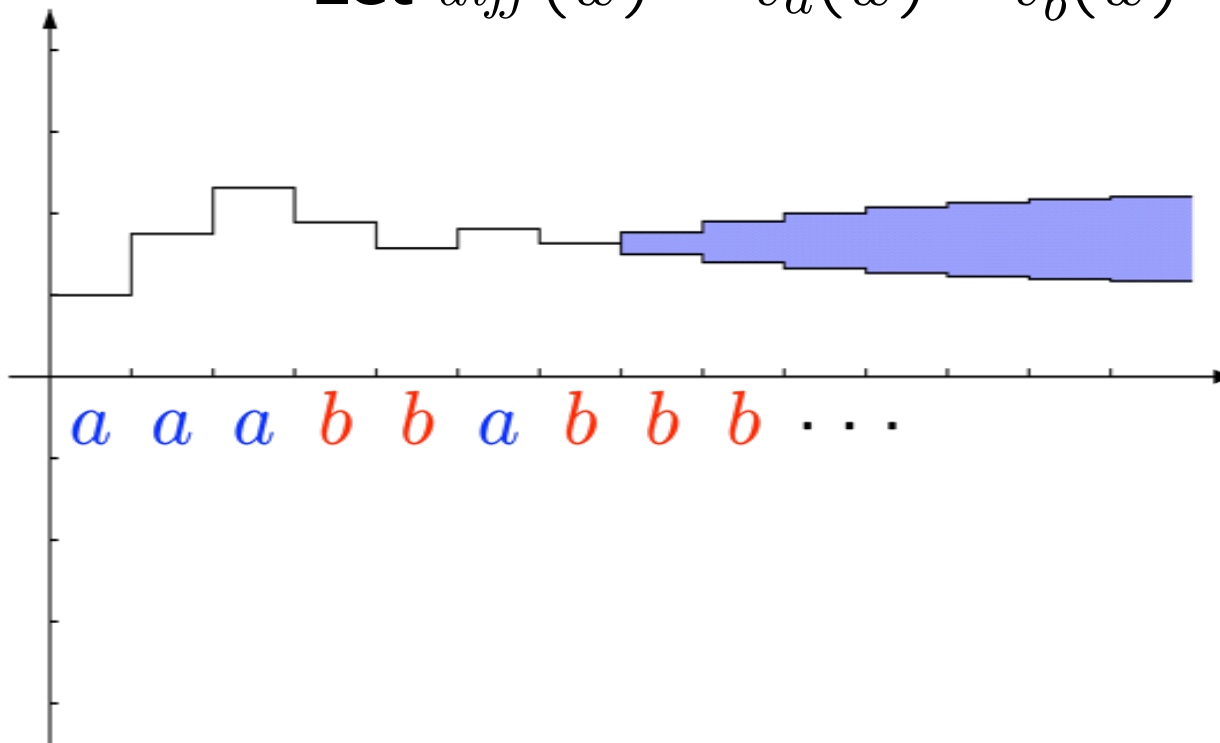
# Disc <sub>$\lambda$</sub> cannot be determinized

---

$$v_a(w) = \sum_{i|w_i=a}^{|w|} \lambda^i$$

$$v_b(w) = \sum_{i|w_i=b}^{|w|} \lambda^i$$

Let  $diff(w) = v_a(w) - v_b(w)$

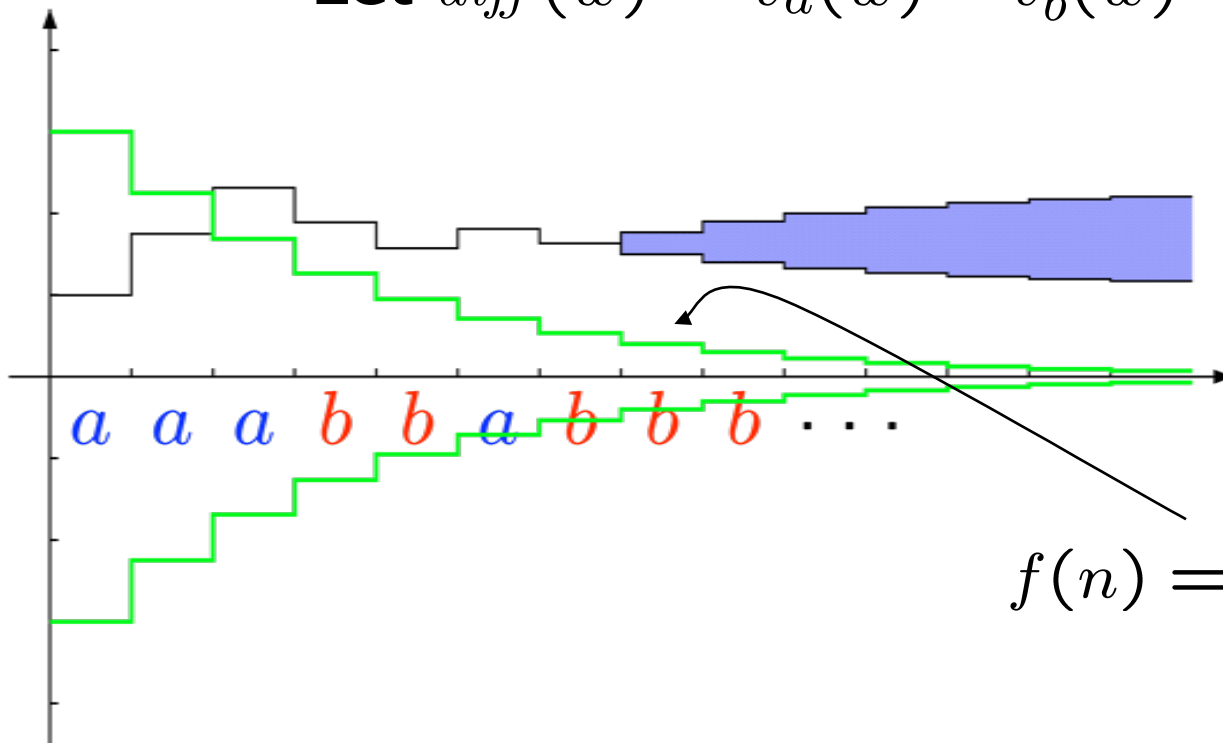


# Disc<sub>λ</sub> cannot be determinized

$$v_a(w) = \sum_{i|w_i=a} \lambda^i$$

$$v_b(w) = \sum_{i|w_i=b} \lambda^i$$

Let  $diff(w) = v_a(w) - v_b(w)$



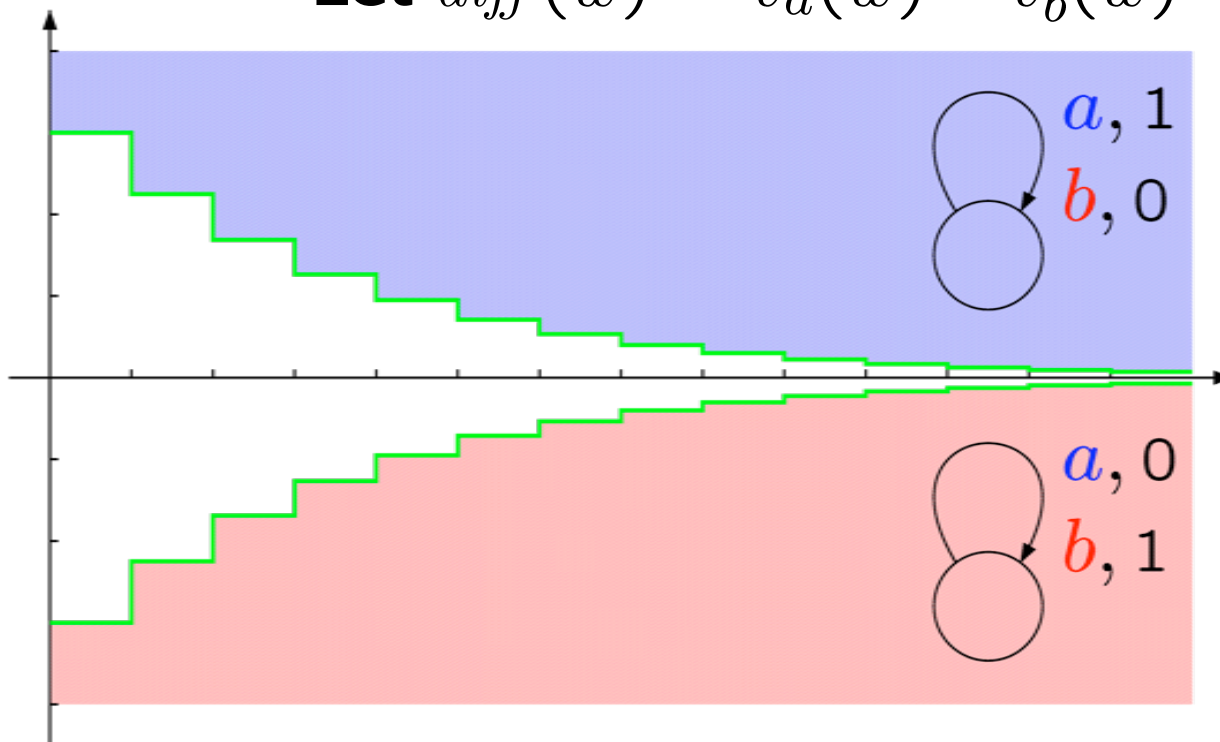


# Disc<sub>λ</sub> cannot be determinized

$$v_a(w) = \sum_{i|w_i=a} \lambda^i$$

$$v_b(w) = \sum_{i|w_i=b} \lambda^i$$

Let  $diff(w) = v_a(w) - v_b(w)$



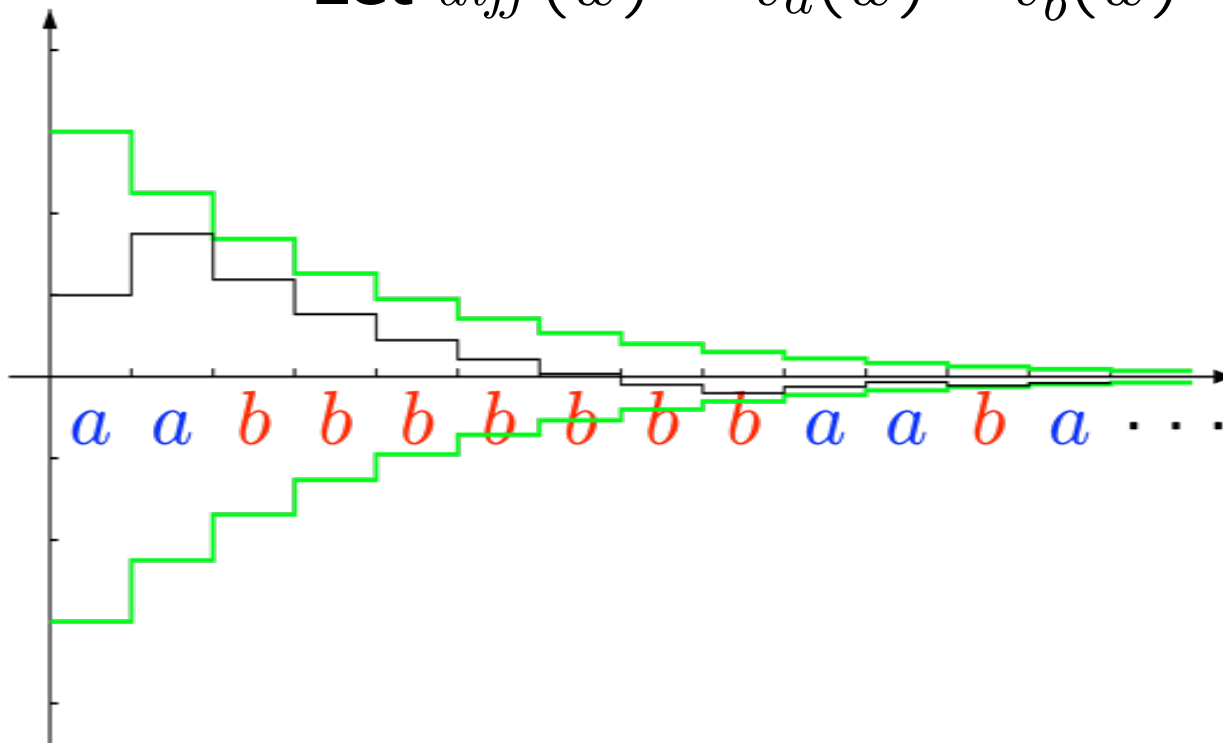
# Disc <sub>$\lambda$</sub> cannot be determinized

---

$$v_a(w) = \sum_{i|w_i=a}^{|w|} \lambda^i$$

$$v_b(w) = \sum_{i|w_i=b}^{|w|} \lambda^i$$

Let  $diff(w) = v_a(w) - v_b(w)$



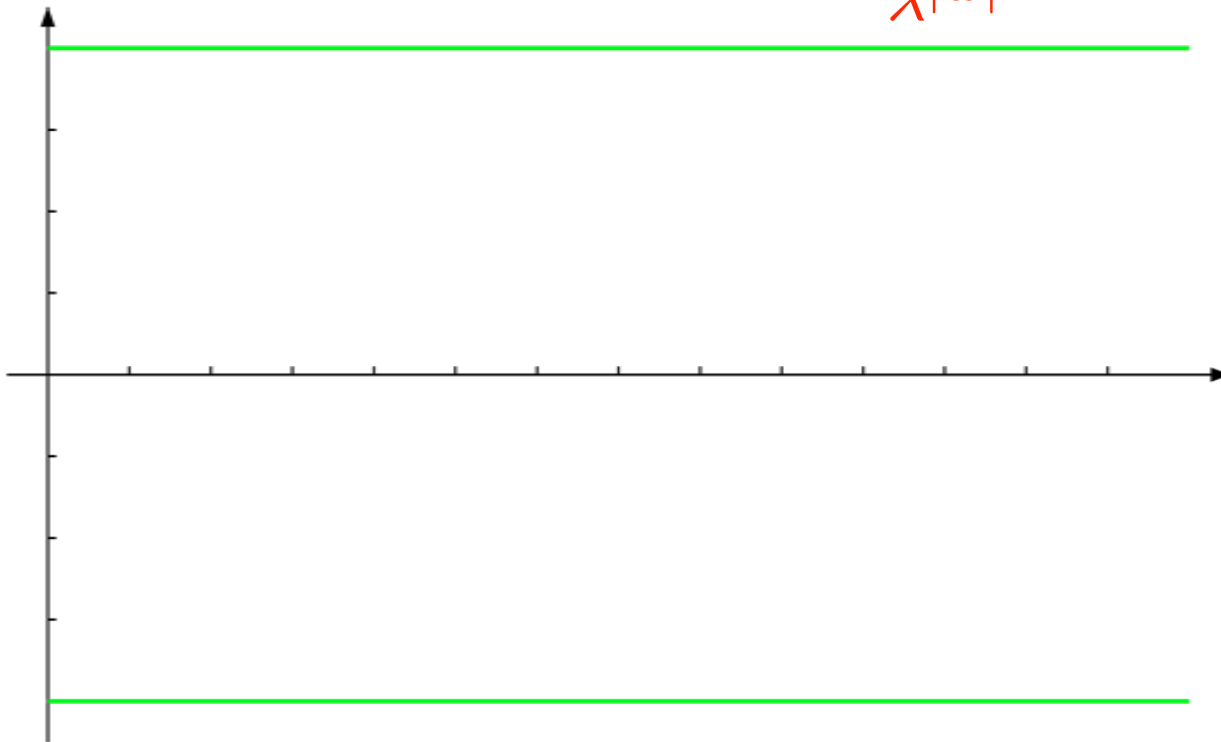
# Disc <sub>$\lambda$</sub> cannot be determinized

---

$$v_a(w) = \sum_{i|w_i=a}^{|w|} \lambda^i$$

$$v_b(w) = \sum_{i|w_i=b}^{|w|} \lambda^i$$

$$\text{Let } \text{diff}(w) = \frac{v_a(w) - v_b(w)}{\lambda^{|w|}}$$



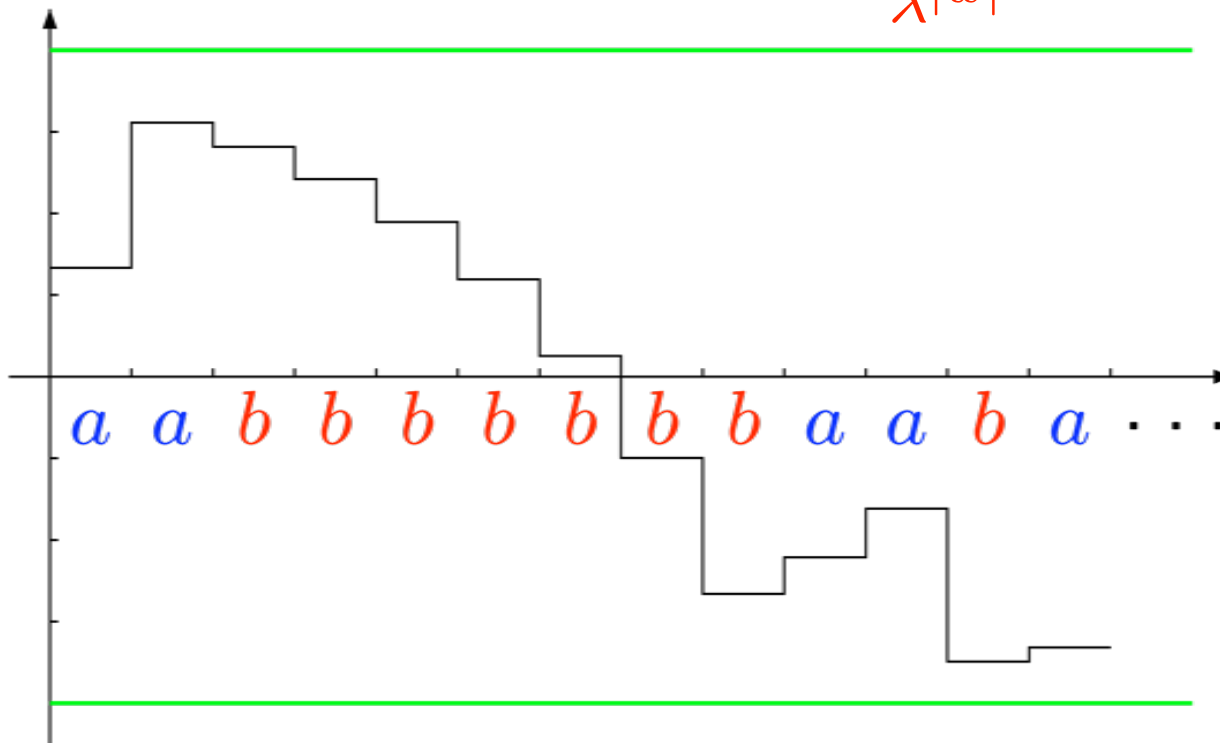
# Disc <sub>$\lambda$</sub> cannot be determinized

---

$$v_a(w) = \sum_{i|w_i=a} \lambda^i$$

$$v_b(w) = \sum_{i|w_i=b} \lambda^i$$

$$\text{Let } \text{diff}(w) = \frac{v_a(w) - v_b(w)}{\lambda^{|w|}}$$



# Disc $_{\lambda}$ cannot be determinized

---

$$v_a(w) = \sum_{i|w_i=a}^{|w|} \lambda^i \qquad v_b(w) = \sum_{i|w_i=b}^{|w|} \lambda^i$$

$$\text{Let } \mathit{diff}(w) = \frac{v_a(w) - v_b(w)}{\lambda^{|w|}}$$

If  $\mathit{diff}(w) = s$

$$\text{then } \begin{cases} \mathit{diff}(w \cdot a) & = \frac{v_a(w) + \lambda^{|w|} - v_b(w)}{\lambda^{|w|+1}} & = \frac{s+1}{\lambda} \\ \mathit{diff}(w \cdot b) & = \frac{v_a(w) - v_b(w) - \lambda^{|w|}}{\lambda^{|w|+1}} & = \frac{s-1}{\lambda} \end{cases}$$

# Disc<sub>λ</sub> cannot be determinized

---

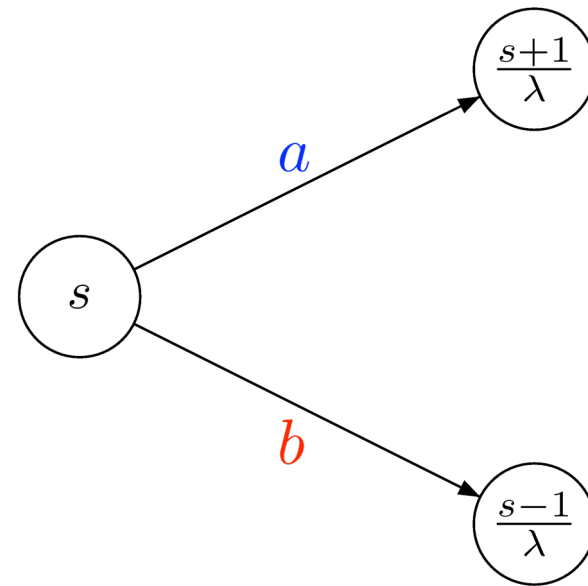
$$v_a(w) = \sum_{i|w_i=a} \lambda^i$$

$$v_b(w) = \sum_{i|w_i=b} \lambda^i$$

$$\text{Let } \text{diff}(w) = \frac{v_a(w) - v_b(w)}{\lambda^{|w|}}$$

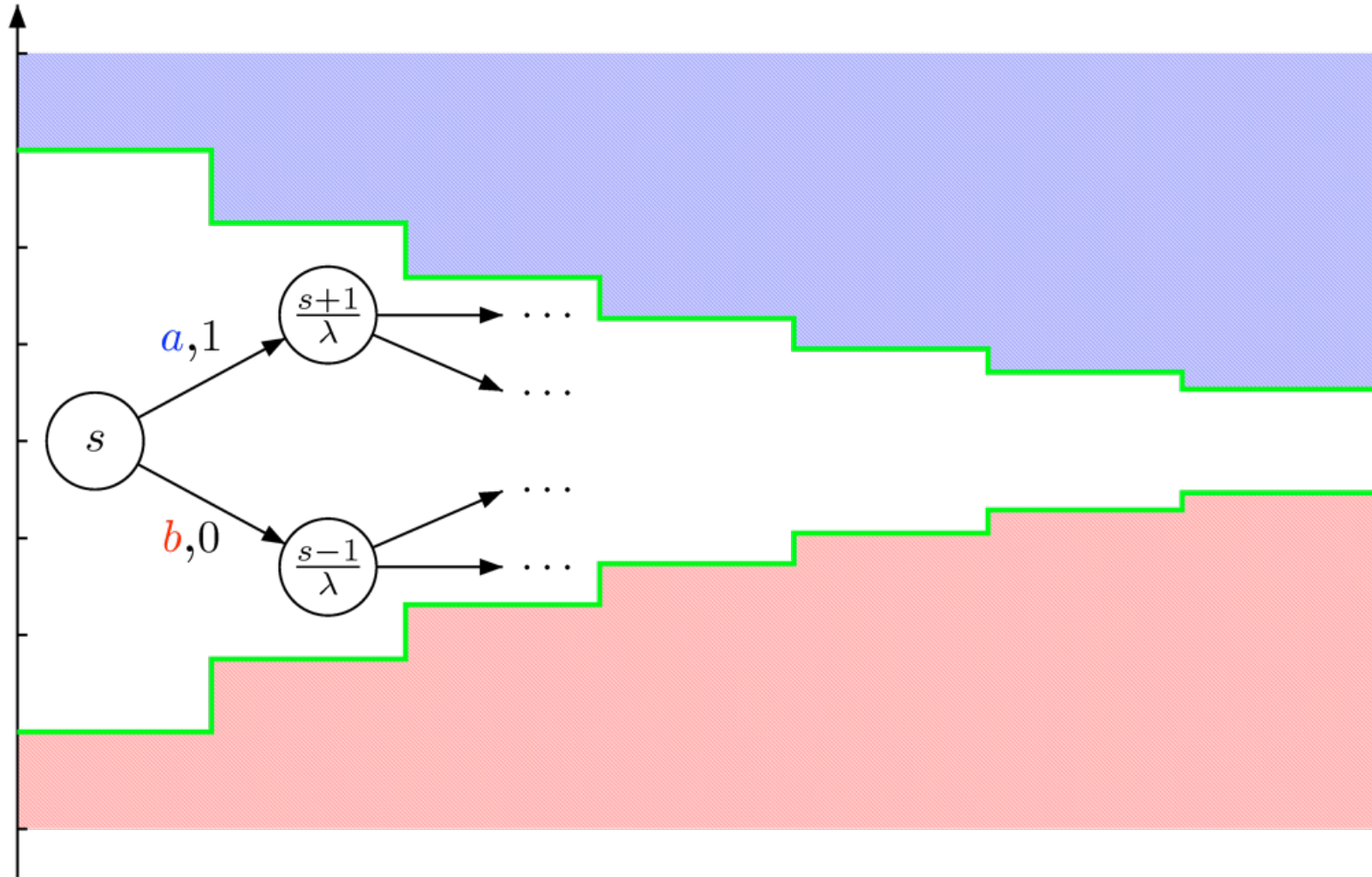
If  $\text{diff}(w) = s$

$$\text{then } \begin{cases} \text{diff}(w \cdot a) = \frac{s+1}{\lambda} \\ \text{diff}(w \cdot b) = \frac{s-1}{\lambda} \end{cases}$$

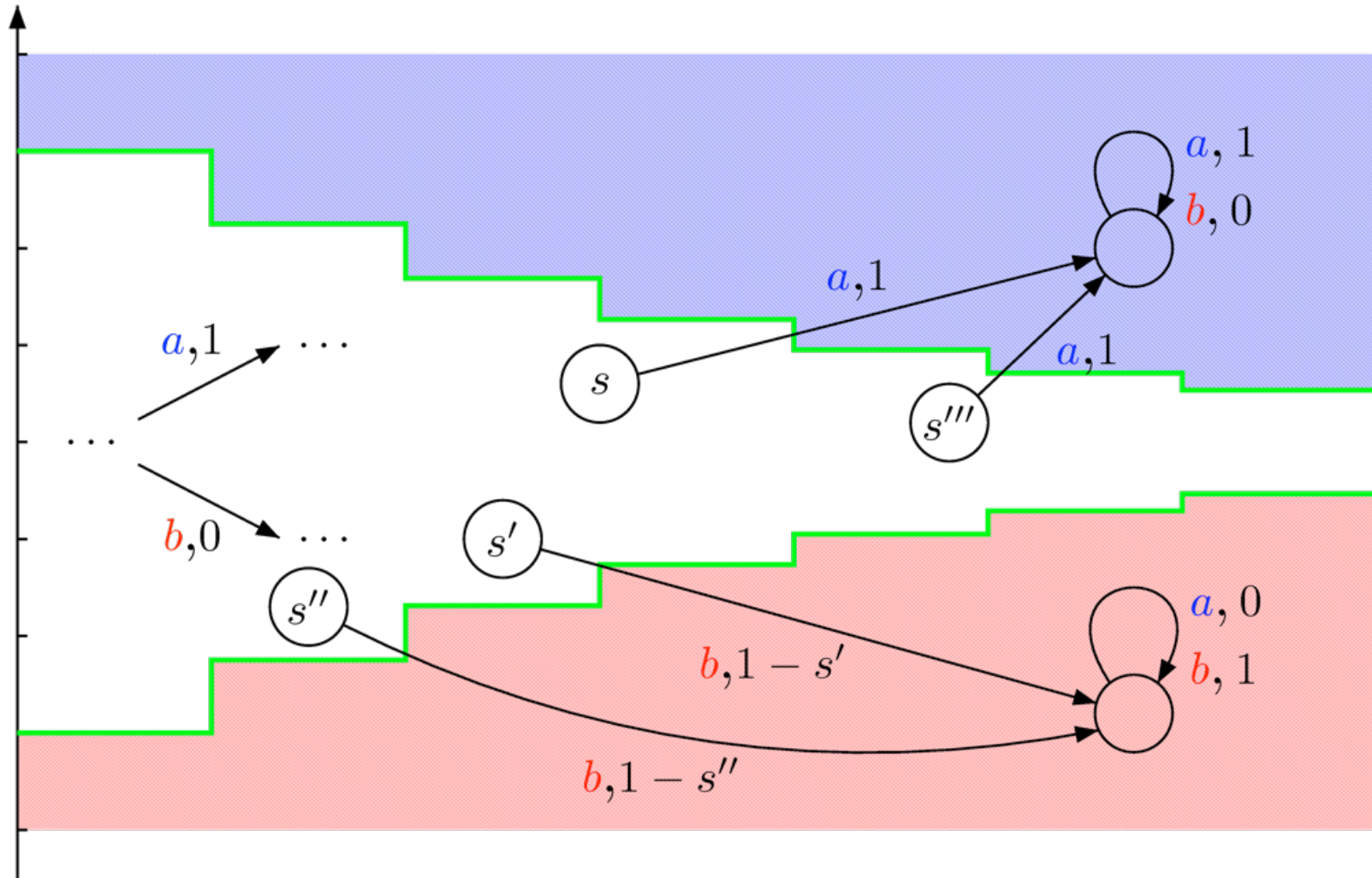


# Disc <sub>$\lambda$</sub> cannot be determinized

---



# Disc <sub>$\lambda$</sub> cannot be determinized



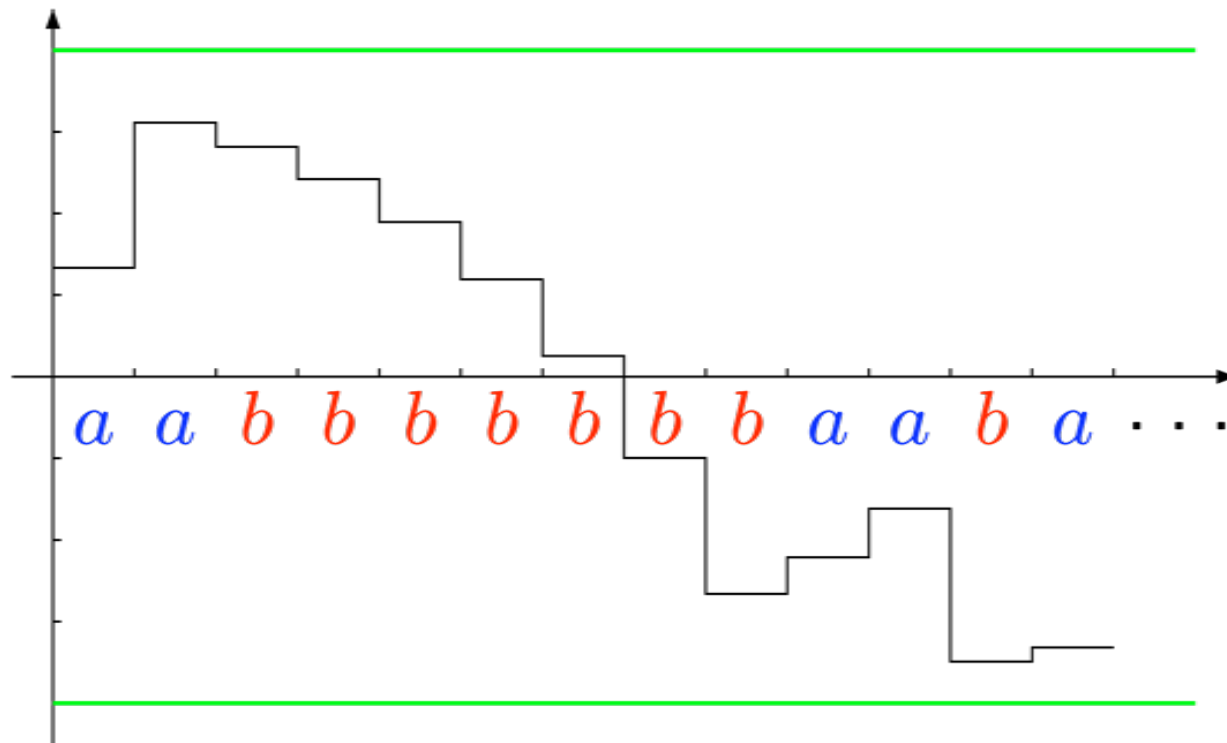


# Disc <sub>$\lambda$</sub> cannot be determinized

---

$$\text{diff}(w) = \frac{v_a(w) - v_b(w)}{\lambda|w|}$$

How many different values can  $\text{diff}(w)$  take ?

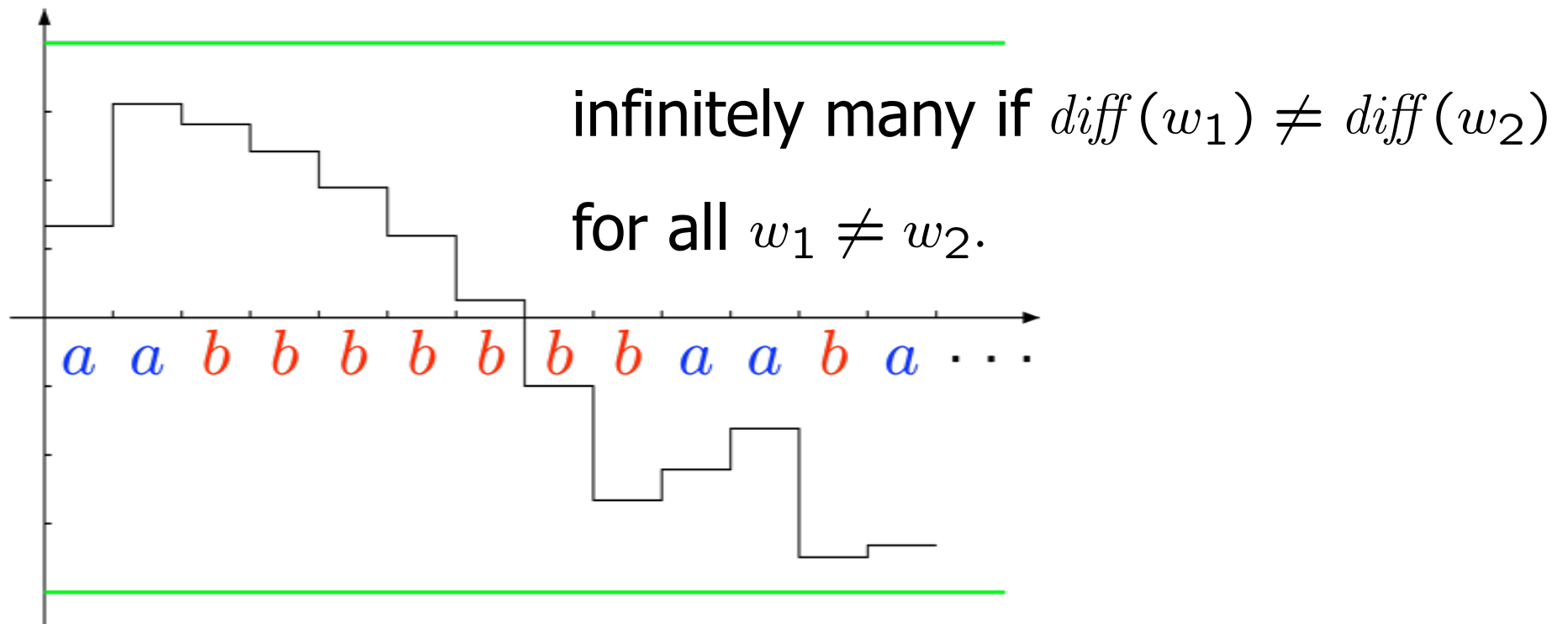


# Disc<sub>λ</sub> cannot be determinized

---

$$\text{diff}(w) = \frac{v_a(w) - v_b(w)}{\lambda|w|}$$

How many different values can  $\text{diff}(w)$  take ?



# Disc <sub>$\lambda$</sub> cannot be determinized

---

$$\text{diff}(w) = \frac{v_a(w) - v_b(w)}{\lambda|w|}$$

How many different values can  $\text{diff}(w)$  take ?

infinitely many if  $\text{diff}(w_1) \neq \text{diff}(w_2)$

for all  $w_1 \neq w_2$ .

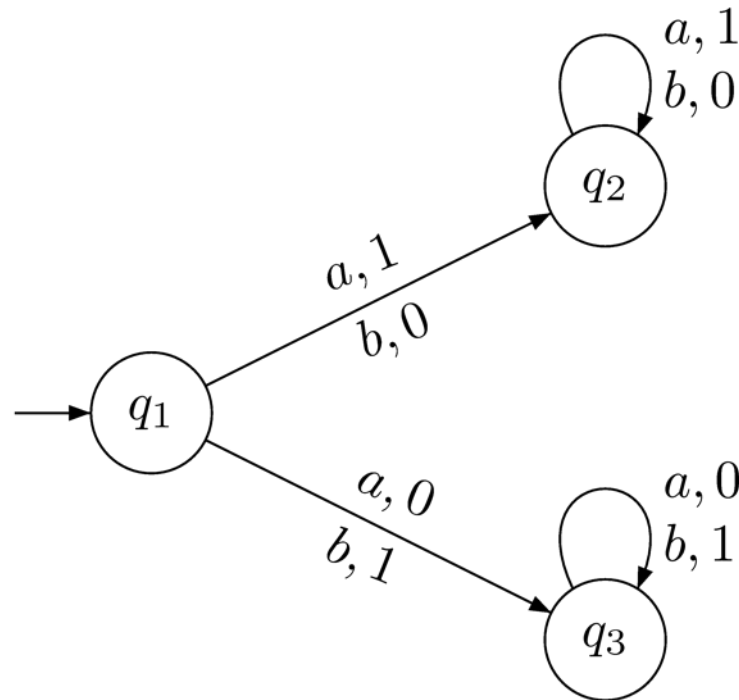
By a careful analysis of the shape of the family of equations,

it can be proven that no rational  $\lambda \in ]\frac{1}{2}, 1[$  can be a solution.

# Last result

---

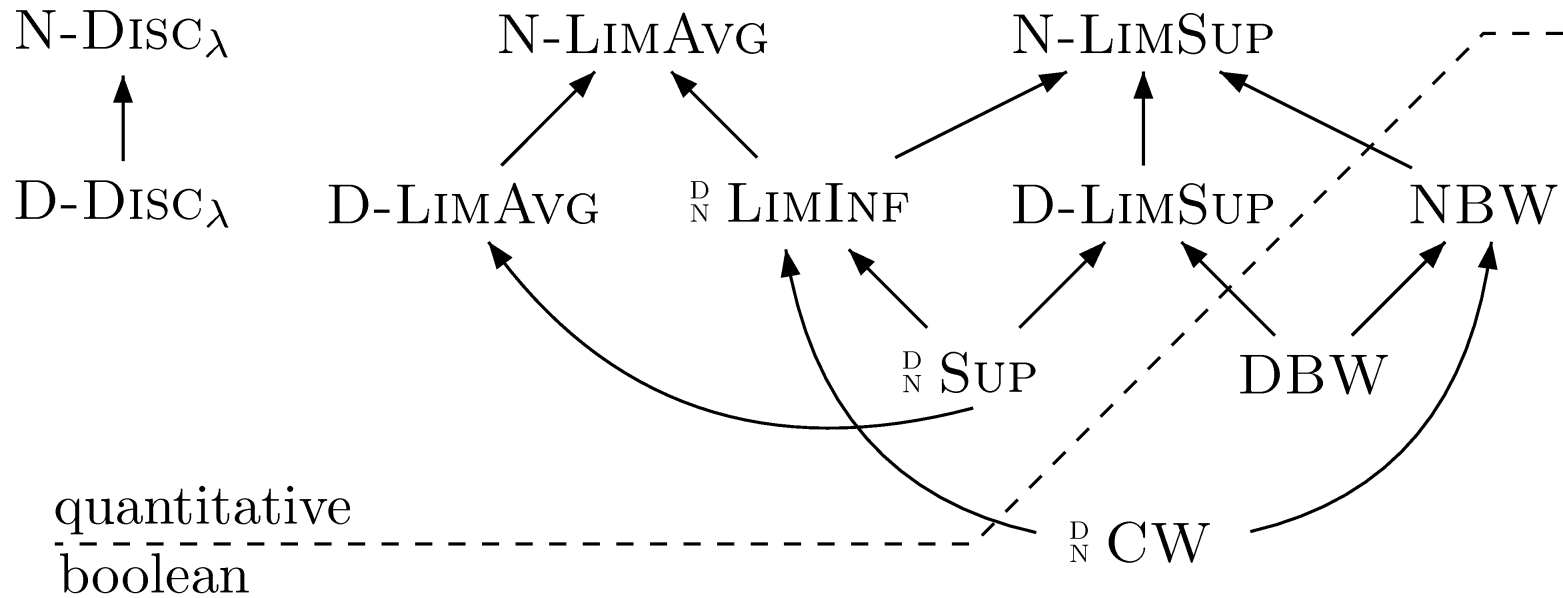
$\text{Disc}_\lambda$  cannot be determinized.



$$\lambda = 3/4$$

# Reducibility relations

---



# Outline

---

- Motivation
- Weighted automata
- Decision problems
- Expressive power
- Closure properties

# Operations

---

$$L_1, L_2 : \Sigma^\omega \rightarrow \mathbb{R}$$

Operations on quantitative languages:

- $\text{shift}(L_1, c)(w) = L_1(w) + c$
- $\text{scale}(L_1, c)(w) = c \cdot L_1(w) \quad (c > 0)$

# Operations

---

$$L_1, L_2 : \Sigma^\omega \rightarrow \mathbb{R}$$

Operations on quantitative languages:

- $\text{shift}(L_1, c)(w) = L_1(w) + c$
- $\text{scale}(L_1, c)(w) = c \cdot L_1(w) \quad (c > 0)$
- $\text{max}(L_1, L_2)(w) = \max(L_1(w), L_2(w))$   $L_1 \cup L_2$
- $\text{min}(L_1, L_2)(w) = \min(L_1(w), L_2(w))$   $L_1 \cap L_2$
- $\text{complement}(L_1)(w) = 1 - L_1(w)$   $\Sigma^\omega \setminus L_1$



# Operations

---

$$L_1, L_2 : \Sigma^\omega \rightarrow \mathbb{R}$$

Operations on quantitative languages:

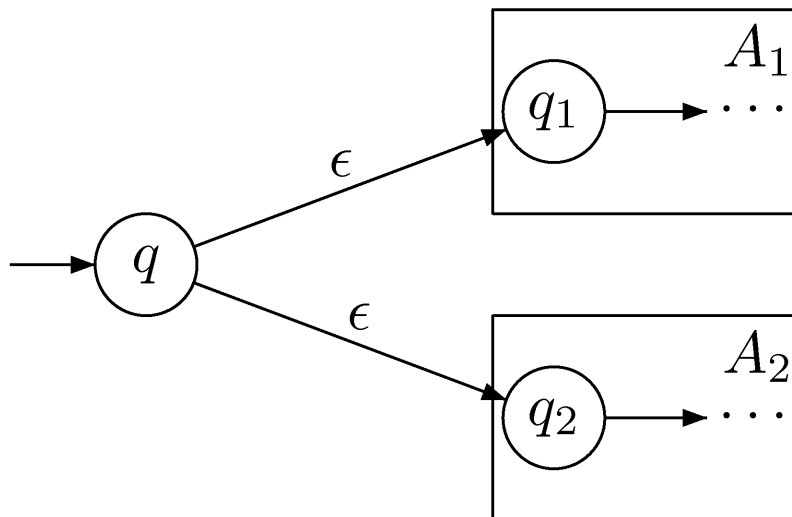
- $\text{shift}(L_1, c)(w) = L_1(w) + c$
- $\text{scale}(L_1, c)(w) = c \cdot L_1(w) \quad (c > 0)$
- $\text{max}(L_1, L_2)(w) = \max(L_1(w), L_2(w))$   $L_1 \cup L_2$
- $\text{min}(L_1, L_2)(w) = \min(L_1(w), L_2(w))$   $L_1 \cap L_2$
- $\text{complement}(L_1)(w) = 1 - L_1(w)$   $\Sigma^\omega \setminus L_1$
- $\text{sum}(L_1, L_2)(w) = L_1(w) + L_2(w)$

# Closure properties

All classes of weighted automata are closed under **shift** and **scale**.



All classes of nondeterministic weighted automata are closed under **max**.



# Closure properties

---

	$\cup$	$\cap$	$\Sigma^\omega \setminus L$	
	max	min	comp.	sum
$\overset{D}{N}$ SUP	✓			
$\overset{D}{N}$ LIMINF	✓			
DLIMSUP	✓			
NLIMSUP	✓			
DLIMAVG	×			
NLIMAVG	✓			
DDISC	×			
NDISC	✓			

# Closure properties

---

	$\cup$	$\cap$	$\Sigma^\omega \setminus L$	
	max	min	comp.	sum
$\text{D}_N \text{ SUP}$	✓	✓	×	✓
$\text{D}_N \text{ LIMINF}$	✓	✓	×	✓
$\text{DLIMSUP}$	✓	✓	×	✓
$\text{NLIMSUP}$	✓	✓	✓	✓
$\text{DLIMAVG}$	×			
$\text{NLIMAVG}$	✓			
$\text{DDISC}$	×			
$\text{NDISC}$	✓			

Analogous results for boolean languages.

# Closure properties

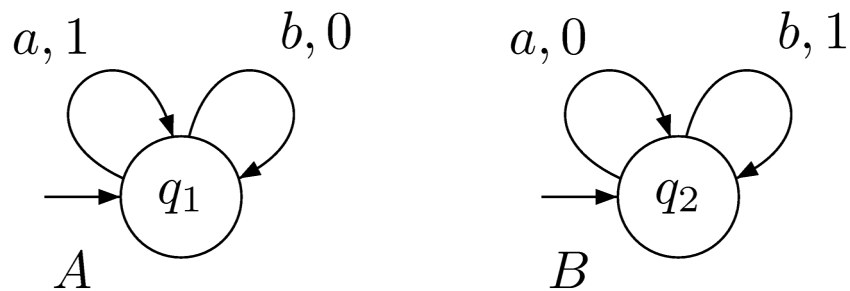
---

There is no nondeterministic LimAvg automaton for the language  $L_m = \min(L_a, L_b)$ .

# Closure properties

---

There is no nondeterministic LimAvg automaton for the language  $L_m = \min(L_a, L_b)$ .

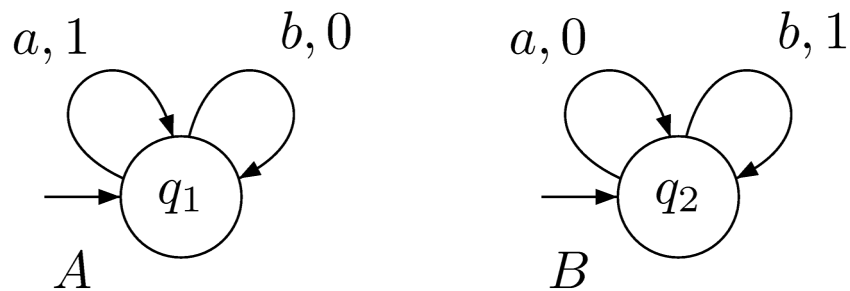


Assume that  $L_m = \min(L_a, L_b)$  is definable by a LimAvg automaton C.

# Closure properties

---

There is no nondeterministic LimAvg automaton for the language  $L_m = \min(L_a, L_b)$ .



Assume that  $L_m = \min(L_a, L_b)$  is definable by a LimAvg automaton C.

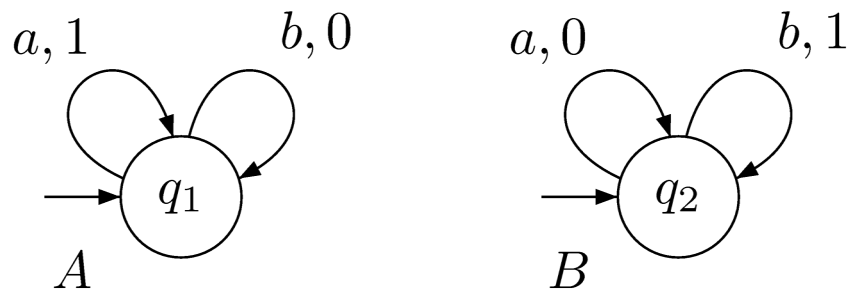
Then, **some** a-cycle or b-cycle in C has average weight  $> 0$ .

(consider the word  $(a^m b^m)^\omega$  for  $m$  large)

# Closure properties

---

There is no nondeterministic LimAvg automaton for the language  $L_m = \min(L_a, L_b)$ .



Assume that  $L_m = \min(L_a, L_b)$  is definable by a LimAvg automaton C.

Then, **some** a-cycle (or b-cycle) in C has average weight  $> 0$ .

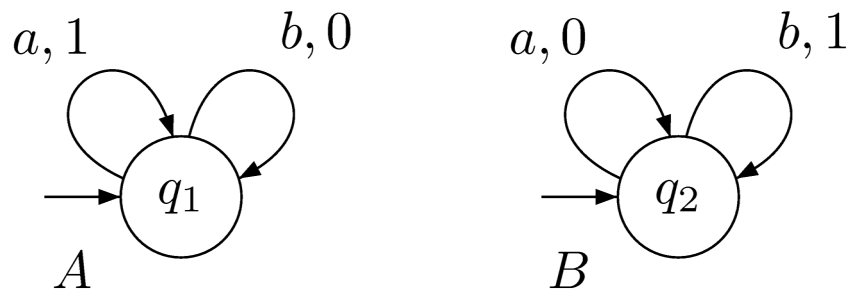
Then, some word  $w_C.a^\omega$  gets value  $> 0$ ...



# Closure properties

---

There is no nondeterministic LimAvg automaton for the language  $L_m = \min(L_a, L_b)$ .



There is no nondeterministic Discounted automaton for the language  $L_m = \min(L_a, L_b)$ .

Proof: analogous argument.

# Closure properties

---

	$\cup$	$\cap$	$\Sigma^\omega \setminus L$	
	max	min	comp.	sum
$\mathbb{D}_N$ SUP	✓	✓	×	✓
$\mathbb{D}_N$ LIMINF	✓	✓	×	✓
DLIMSUP	✓	✓	×	✓
NLIMSUP	✓	✓	✓	✓
DLIMAVG	×	×		
NLIMAVG	✓	×		
DDISC	×	×		
NDISC	✓	×		

# Closure properties

---

	$\cup$	$\cap$	$\Sigma^\omega \setminus L$	
	max	min	comp.	sum
$\text{D}_N \text{ SUP}$	✓	✓	×	✓
$\text{D}_N \text{ LIMINF}$	✓	✓	×	✓
$\text{DLIMSUP}$	✓	✓	×	✓
$\text{NLIMSUP}$	✓	✓	✓	✓
$\text{DLIMAVG}$	×	×		
$\text{NLIMAVG}$	✓	×	×	
$\text{DDISC}$	×	×		
$\text{NDISC}$	✓	×	×	

$$\min(L_1, L_2) = 1 - \max(1 - L_1, 1 - L_2)$$

# Closure properties

---

	$\cup$	$\cap$	$\Sigma^\omega \setminus L$	
	max	min	comp.	sum
$\frac{D}{N}$ SUP	✓	✓	×	✓
$\frac{D}{N}$ LIMINF	✓	✓	×	✓
DLIMSUP	✓	✓	×	✓
NLIMSUP	✓	✓	✓	✓
DLIMAVG	×	×	×	×
NLIMAVG	✓	×	×	×
DDISC	×	×	✓	✓
NDISC	✓	×	×	✓

By analogous arguments (analysis of cycles).

# Conclusion

---

- Quantitative generalization of languages to model programs/systems more accurately.
- LimAvg and  $\text{Disc}_\lambda$ : deciding language inclusion is open;
- Simulation is a decidable over-approximation.
- Expressive power classification:
  - DBW and LimAvg are incomparable;
  - LimAvg and Disc cannot be determined.
- Closure properties.

# Other lines of work

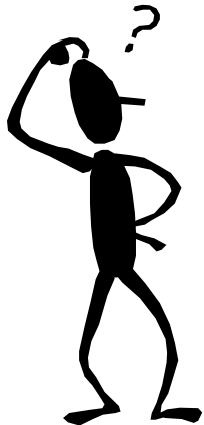
---

- Cut-point languages, stability/robustness (LICS'09)
- Alternating/Probabilistic extensions (CONCUR'09, FCT'09)
- Robust class of Limit-Average automata (ongoing work)
- Open problem: quantitative universality (partial results)
- Other/equivalent formalisms for quantitative specification ?

# The end

---

## Thank you !



## Questions ?



ÉCOLE POLYTECHNIQUE  
FÉDÉRALE DE LAUSANNE

---