

# Learning Real-Time One-Counter Automata Using Polynomially Many Queries

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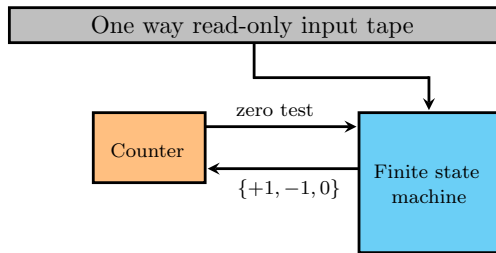
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Joint work with: Dr. A.V. Sreejith, Indian Institute of Technology Goa and  
Dr. Vincent Penelle, University of Bordeaux

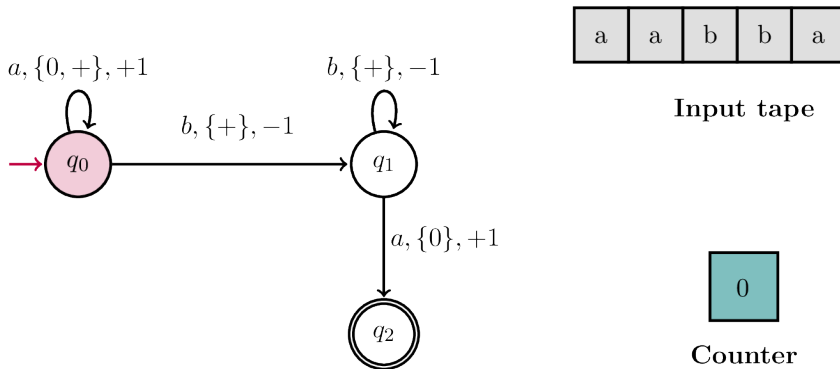
TACAS 2025  
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# Deterministic real-time one-counter automata (DROCA)



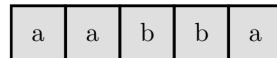
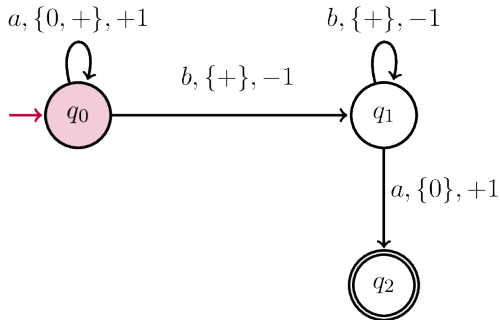
- Write to counter: Increment (+1), No change (0), Decrement (-1).
- Read from counter: zero (0) or positive (+).
- Counter-value is always non-negative.
- Transitions of the finite-state machine are deterministic.
- There are no  $\varepsilon$ - transitions.

## Example: Deterministic real-time one-counter automata



$$\mathcal{L} = \{a^n b^n a \mid n > 0\}$$

## Example: Deterministic real-time one-counter automata



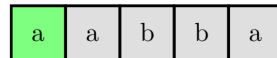
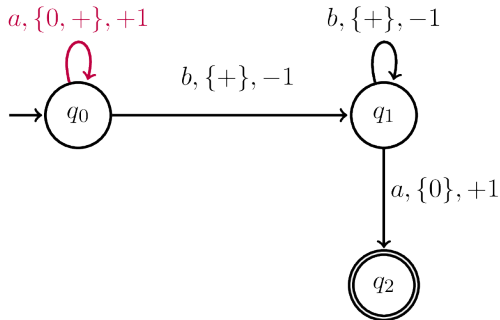
Input tape



Counter



## Example: Deterministic real-time one-counter automata

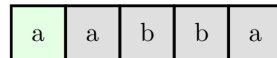
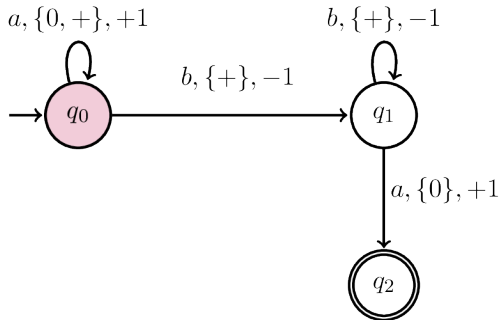


Input tape



Counter

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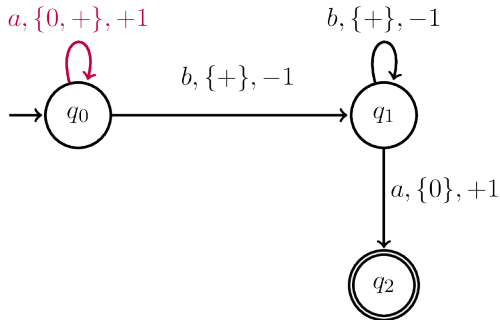


Input tape



Counter

## Example: Deterministic real-time one-counter automata

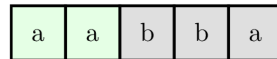
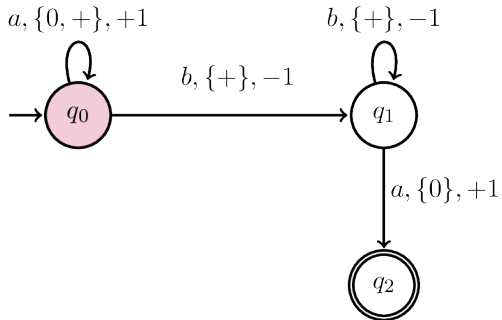


Input tape



Counter

## Example: Deterministic real-time one-counter automata

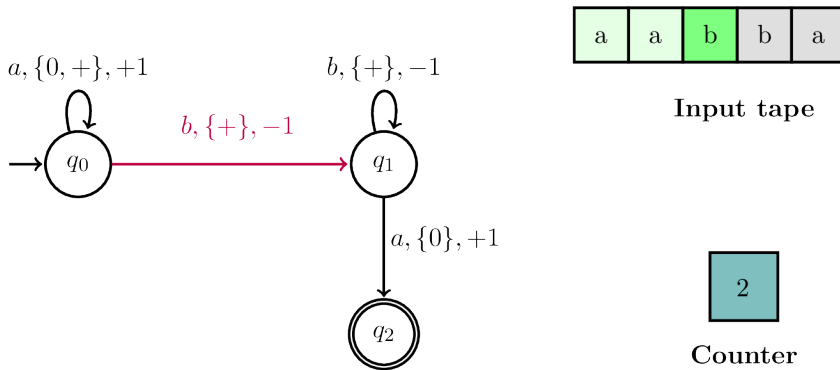


Input tape

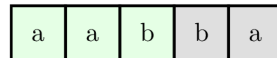
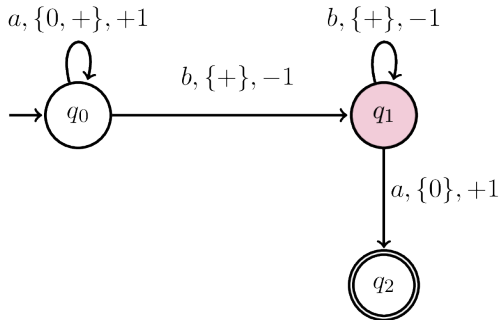


Counter

## Example: Deterministic real-time one-counter automata



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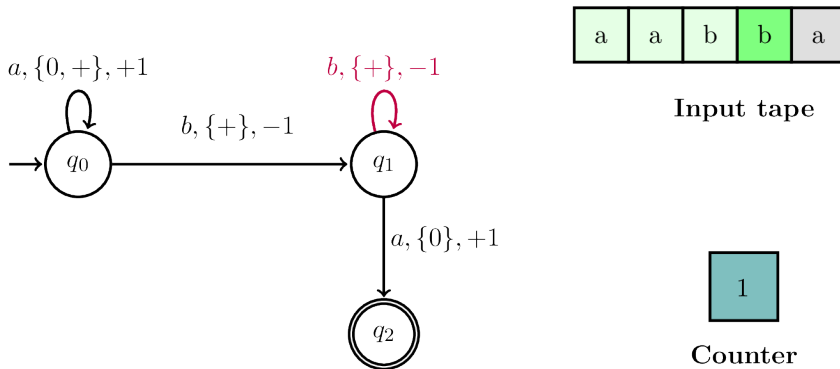


Input tape

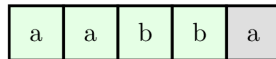
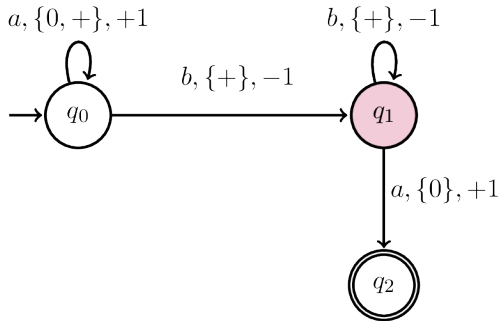


Counter

## Example: Deterministic real-time one-counter automata



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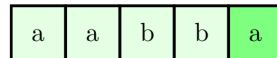
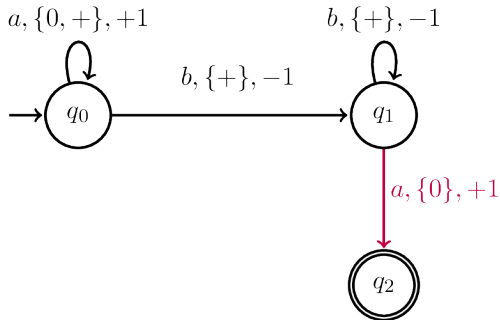
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Counter



## Example: Deterministic real-time one-counter automata

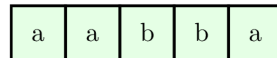
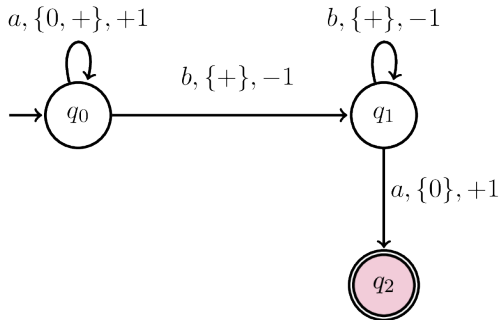


Input tape



Counter

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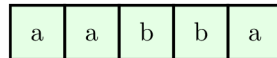
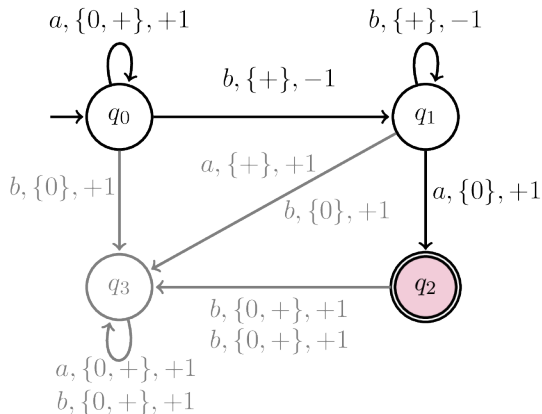


Input tape



Counter

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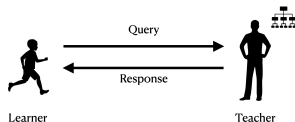
Input tape



Counter

# Active Learning DROCs

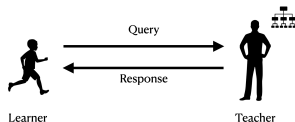
# Short history: Learning one-counter automata



(Gold, 1978) → Inferring smallest DFA from a set of labelled samples is NP-complete.

(Angluin, 1987) → Active learning of DFA in polynomial time.

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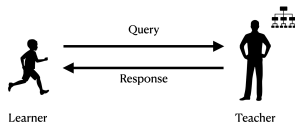


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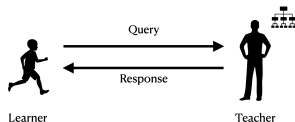
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(Bruyère et. al, 2022) → Learning DROCA with an additional counter-value query in EXPTIME.



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2. Number of queries — exponential.
3. Time taken to learn — exponential.

- In this talk, we address the first two bottlenecks.

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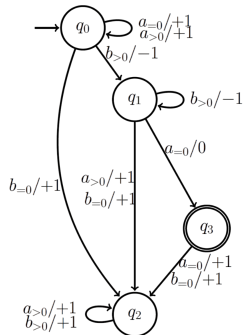
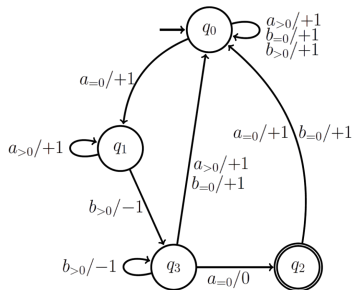


# Equivalence - A practical approach

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- Two DROCAs are counter-synchronous if they reach the same counter value on all words.

# Equivalence - A practical approach

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- We propose *counter-synchronous* equivalence.
- Two DROCAs are counter-synchronous if they reach the same counter value on all words.



Counter-synchronous DROCAs recognising the language  $\{a^n b^n a \mid n > 0\}$ .

# Counter-synchronous equivalence

## Theorem - Counter-synchronous equivalence

Given two DROCAs of size  $n$  (not counter-synchronous or not equivalent), there is an  $\mathcal{O}(n^6)$  time algorithm to find a word  $w$  such that either  $w$  is accepted by exactly one DROCA, or counter value of  $w$  is different on both DROCAs.

- For visibly OCAs, there is an  $\mathcal{O}(n^3)$  time algorithm to check equivalence.

# MinOCA

# Types of queries

## Membership queries:

Learner: “Is  $w$  in  $\mathcal{L}(\mathcal{A})$ ?”

Teacher : “**yes**” or “**no**”

## Counter-value queries:

Learner: “What is the counter-value reached on reading  $w$ ?”

Teacher: “**counter-value reached on  $w$** ”

## Minimal-equivalence queries:

Learner: “Does  $\mathcal{B}$  and  $\mathcal{A}$  recognise the same language?”

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Theorem - Polynomially many queries

MinOCA is in  $P^{NP}$  and queries the teacher polynomially many times.

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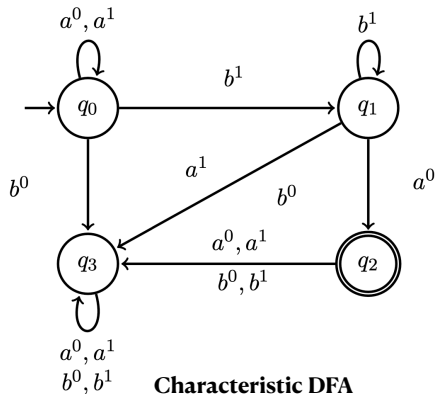
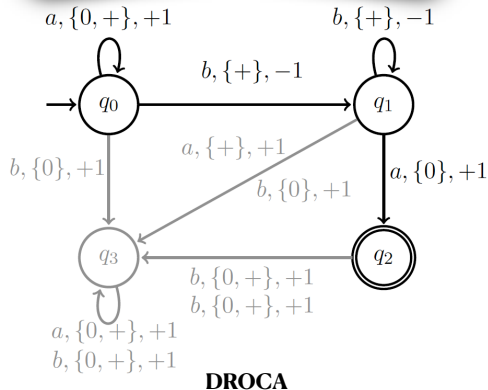
Theorem - Polynomially many queries

MinOCA is in  $P^{NP}$  and queries the teacher polynomially many times.

- MinOCA returns a minimal counter-synchronous DROCA.
- Our evaluations show that MinOCA outperforms the existing technique.

# Characteristic DFA

$$\mathcal{L} = \{a^n b^n a \mid n > 0\}$$



- The primary idea is to try and learn the characteristic DFA.

# Observation table

	Counter Value	$\mathcal{E}$	
		Memb	Actions
$\mathcal{E}$	0	0	(0, +1, +1)
a	1	0	(1,+1,-1)
ab	0	0	(0,+1,+1)
aba	1	1	(1,+1,+1)
b	1	0	(1,+1,+1)
aa	2	0	(1,+1,-1)
abb	1	0	(1,+1,+1)
abaa	2	0	(1,+1,+1)
abab	2	0	(1,+1,+1)

Two rows have the same color if they are equal.

# Observation table

	Counter Value	$\mathcal{E}$	
		Memb	Actions
$\epsilon$	0	0	(0, +1, +1)
a	1	0	(1,+1,-1)
ab	0	0	(0,+1,+1)
aba	1	1	(1,+1,+1)
b	1	0	(1,+1,+1)
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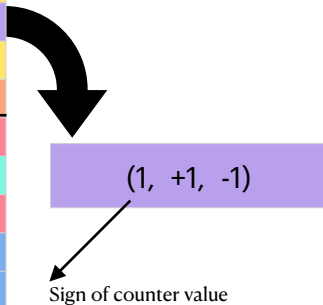


(1, +1, -1)

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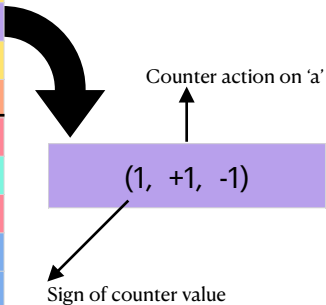


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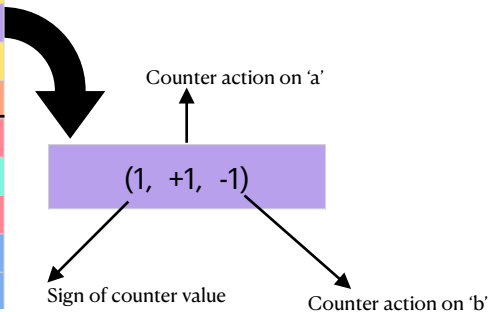
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# d-closed table

$\varepsilon$

$\varepsilon$

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$\epsilon$	0	0	(0, +1, +1)
a	1	0	(1,+1,-1)
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aa	2	0	(1,+1,-1)
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abaa	2	0	(1,+1,+1)
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Color not present in the top part

Not 1-Closed

- A table is **d-closed** if each row in the bottom part with counter value  $\leq d$ , is *equal* to at least one row in the top part.

# d-closed table

	Counter Value	$\mathcal{E}$	
		Memb	Actions
$\epsilon$	0	0	(0, +1, +1)
a	1	0	(1,+1,-1)
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Move it to the top part and add it's one letter extensions to the bottom part.

# d-closed table

	Counter Value	$\mathcal{E}$	
		Memb	Actions
$\epsilon$	0	0	(0, +1, +1)
a	1	0	(1, +1, -1)
ab	0	0	(0, +1, +1)
aba	1	1	(1, +1, +1)
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aa	2	0	(1, +1, -1)
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abab	2	0	(1, +1, +1)
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abab	2	0	(1,+1,+1)
ba	2	0	(1,+1,+1)
bb	1	0	(1,+1,+1)

Move it to the top part and add it's one letter extensions to the bottom part.

1-Closed



# d-consistent table

	Counter Value	$\mathcal{E}$	
		Memb	Actions
$\epsilon$	0	0	(0, +1, +1)
a	1	0	(1,+1,-1)
ab	0	0	(0,+1,+1)
aba	1	1	(1,+1,+1)
b	1	0	(1,+1,+1)
aa	2	0	(1,+1,-1)
abb	1	0	(1,+1,+1)
abaa	2	0	(1,+1,+1)
abab	2	0	(1,+1,+1)
ba	2	0	(1,+1,+1)
bb	2	0	(1,+1,+1)

$\epsilon$  and ab have same color

But  $\epsilon.a \neq ab.a$

Add 'a' to the column

- A table is **d-consistent** if equal rows with counter value  $\leq d$  in the top part has equal extensions.

Not 0-Consistent

# d-consistent table

	Counter Value	$\varepsilon$		$a$	
		Memb	Actions	Memb	Actions
$\varepsilon$	0	0	(0, +1, +1)	0	(1,+1,-1)
$a$	1	0	(1,+1,-1)	0	(1,+1,-1)
$ab$	0	0	(0,+1,+1)	1	(1,+1,+1)
$aba$	1	1	(1,+1,+1)	0	(1,+1,+1)
$b$	1	0	(1,+1,+1)	0	(1,+1,+1)
$aa$	2	0	(1,+1,-1)	0	(1,+1,-1)
$abb$	1	0	(1,+1,+1)	0	(1,+1,+1)
$abaa$	2	0	(1,+1,+1)	0	(1,+1,+1)
$abab$	2	0	(1,+1,+1)	0	(1,+1,+1)
$ba$	2	0	(1,+1,+1)	0	(1,+1,+1)
$bb$	2	0	(1,+1,+1)	0	(1,+1,+1)

# d-consistent table

	Counter Value	$\varepsilon$		$a$	
		Memb	Actions	Memb	Actions
$\varepsilon$	0	0	(0, +1, +1)	0	(1,+1,-1)
<b>a</b>	1	0	(1,+1,-1)	0	(1,+1,-1)
<b>ab</b>	0	0	(0,+1,+1)	1	(0,+1,+1)
<b>aba</b>	1	1	(1,+1,+1)	0	(1,+1,+1)
<b>b</b>	1	0	(1,+1,+1)	0	(1,+1,+1)
<b>aa</b>	2	0	(1,+1,-1)	0	(1,+1,-1)
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<b>abaa</b>	2	0	(1,+1,+1)	0	(1,+1,+1)
<b>abab</b>	2	0	(1,+1,+1)	0	(1,+1,+1)
<b>ba</b>	2	0	(1,+1,+1)	0	(1,+1,+1)
<b>bb</b>	2	0	(1,+1,+1)	0	(1,+1,+1)

1-Consistent

# d-consistent table

	Counter Value	$\varepsilon$		$a$	
		Memb	Actions	Memb	Actions
$\varepsilon$	0	0	(0, +1, +1)	0	(1,+1,-1)
<b>a</b>	1	0	(1,+1,-1)	0	(1,+1,-1)
<b>ab</b>	0	0	(0,+1,+1)	1	(0,+1,+1)
<b>aba</b>	1	1	(1,+1,+1)	0	(1,+1,+1)
<b>b</b>	1	0	(1,+1,+1)	0	(1,+1,+1)
<b>aa</b>	2	0	(1,+1,-1)	0	(1,+1,-1)
<b>abb</b>	1	0	(1,+1,+1)	0	(1,+1,+1)
<b>abaa</b>	2	0	(1,+1,+1)	0	(1,+1,+1)
<b>abab</b>	2	0	(1,+1,+1)	0	(1,+1,+1)
<b>ba</b>	2	0	(1,+1,+1)	0	(1,+1,+1)
<b>bb</b>	2	0	(1,+1,+1)	0	(1,+1,+1)

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# d-consistent table

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<b>a</b>	1	0	(1,+1,-1)	0	(1,+1,-1)
<b>ab</b>	0	0	(0,+1,+1)	1	(0,+1,+1)
<b>aba</b>	1	1	(1,+1,+1)	0	(1,+1,+1)
<b>b</b>	1	0	(1,+1,+1)	0	(1,+1,+1)
<b>aa</b>	2	0	(1,+1,-1)	0	(1,+1,-1)
<b>abb</b>	1	0	(1,+1,+1)	0	(1,+1,+1)
<b>abaa</b>	2	0	(1,+1,+1)	0	(1,+1,+1)
<b>abab</b>	2	0	(1,+1,+1)	0	(1,+1,+1)
<b>ba</b>	2	0	(1,+1,+1)	0	(1,+1,+1)
<b>bb</b>	2	0	(1,+1,+1)	0	(1,+1,+1)

$$\{a,b\}^* \rightarrow \{a^0, a^1, b^0, b^1\}^*$$

1-Consistent

# d-consistent table

	Counter Value	$\varepsilon$		$a$	
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$\varepsilon$	0	0	(0, +1, +1)	0	(1,+1,-1)
$a$	1	0	(1,+1,-1)	0	(1,+1,-1)
$ab$	0	0	(0,+1,+1)	1	(0,+1,+1)
$aba$	1	1	(1,+1,+1)	0	(1,+1,+1)
$b$	1	0	(1,+1,+1)	0	(1,+1,+1)
$aa$	2	0	(1,+1,-1)	0	(1,+1,-1)
$abb$	1	0	(1,+1,+1)	0	(1,+1,+1)
$abaa$	2	0	(1,+1,+1)	0	(1,+1,+1)
$abab$	2	0	(1,+1,+1)	0	(1,+1,+1)
$ba$	2	0	(1,+1,+1)	0	(1,+1,+1)
$bb$	2	0	(1,+1,+1)	0	(1,+1,+1)

$$\{a,b\}^* \rightarrow \{a^0, a^1, b^0, b^1\}^*$$

$$a b a \rightarrow a^0 b^1 a^0$$

1-Consistent

## Sketch: MinOCA

1. Initialise the observation table with  $Rows = \{\epsilon\}$ ,  $Columns = \{\epsilon\}$ , and  $d = 0$ .

	Counter Value	$\epsilon$	
		Memb	Actions
$\epsilon$	0		

## Sketch: MinOCA

1. Initialise the observation table with  $Rows = \{\varepsilon\}$ ,  $Columns = \{\varepsilon\}$ , and  $d = 0$ .
2. Construct a  $d$ -closed and  $d$ -consistent observation table **H** using membership & counter-value queries.

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<b>a</b>	1	0	(1,+1,-1)
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<b>a</b>	1	0	(1,+1,-1)
<b>b</b>	1	0	(1,+1,+1)

POS	NEG
	$\varepsilon$
	<b>a</b> <sup>o</sup>
	<b>b</b> <sup>o</sup>

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	Counter Value	$\varepsilon$	
		Memb	Actions
$\varepsilon$	0	0	(0, +1, +1) → <b>x</b>
<b>a</b>	1	0	(1, +1, -1) → <b>y</b>
<b>b</b>	1	0	(1, +1, +1) → <b>z</b>

POS	NEG
	$\varepsilon$
	<b>a</b> <sup>o</sup>
	<b>b</b> <sup>o</sup>

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<b>b</b>	1	0	(1, +1, +1) → <b>z</b>

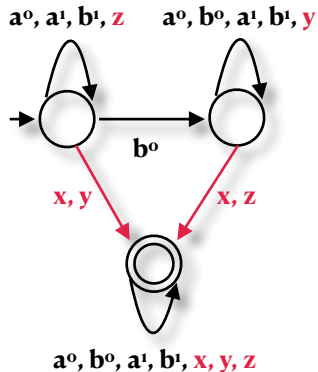
POS	NEG
<b>x</b>	$\varepsilon$
<b>a<sup>o</sup>y</b>	<b>a<sup>o</sup></b>
<b>b<sup>o</sup>z</b>	<b>b<sup>o</sup></b>
	<b>a<sup>o</sup>z</b>
	<b>b<sup>o</sup>y</b>

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		Memb	Actions
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<b>a</b>	1	0	(1, +1, -1)
<b>b</b>	1	0	(1, +1, +1)

POS	NEG
<b>x</b>	$\varepsilon$
<b>a<sup>o</sup>y</b>	$\mathbf{a}^o$
<b>b<sup>o</sup>z</b>	$\mathbf{b}^o$
	$\mathbf{a}^o\mathbf{z}$
	$\mathbf{b}^o\mathbf{y}$

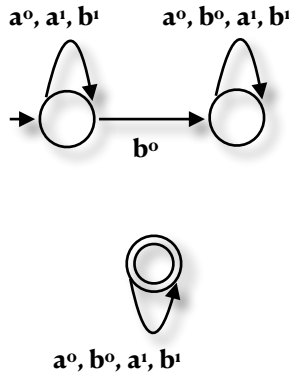


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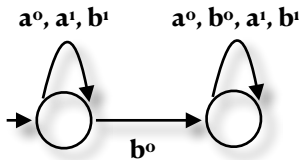
POS	NEG
<b>x</b>	$\varepsilon$
$\mathbf{a^0y}$	$\mathbf{a^0}$
$\mathbf{b^0z}$	$\mathbf{b^0}$
	$\mathbf{a^0z}$
	$\mathbf{b^0y}$



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5. Convert this characteristic DFA to an OCA  $\mathbf{A}$  over  $\Sigma$  and ask equivalence query.

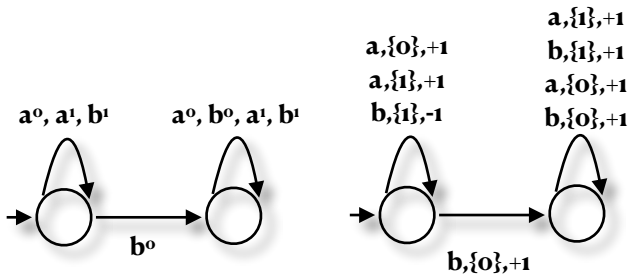
	Counter Value	$\varepsilon$	
		Memb	Actions
$\varepsilon$	0	0	(0, +1, +1)
<b>a</b>	1	0	(1, +1, -1)
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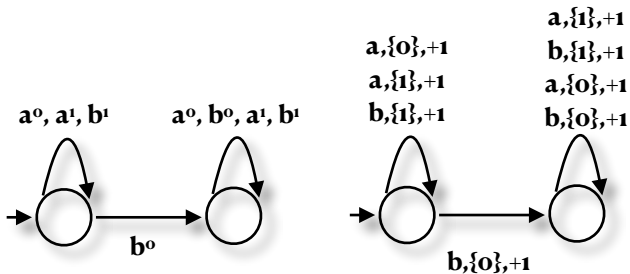
	Counter Value	$\varepsilon$	
		Memb	Actions
$\varepsilon$	0	0	(0, +1, +1)
<b>a</b>	1	0	(1, +1, -1)
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6. If the teacher returns a counter example, then add all its prefixes to  $Rows$ , increment  $d$  & repeat steps 2-5.

	Counter Value	$\varepsilon$	
		Memb	Actions
$\varepsilon$	0	0	(0, +1, +1)
<b>a</b>	1	0	(1, +1, -1)
<b>b</b>	1	0	(1, +1, +1)



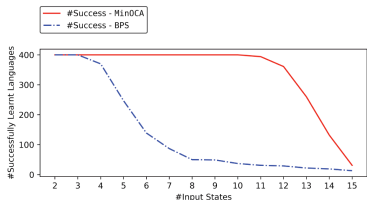


## Sketch: MinOCA

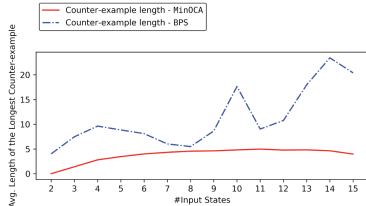
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2. Construct a  $d$ -closed and  $d$ -consistent observation table  $\mathbf{H}$  using membership & counter-value queries.
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6. If the teacher returns a counter example, then add all its prefixes to  $Rows$ , increment  $d$  & repeat steps 2-5.
7. Else stop and output  $\mathbf{A}$ .

# Experimental Results

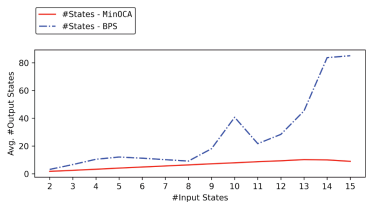
# Comparison with existing method BPS (Bruyère et al., 2022)



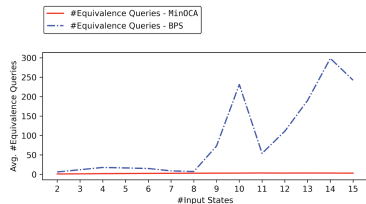
Number of successfully learnt languages (out of 400)



Average length of the longest counter-example

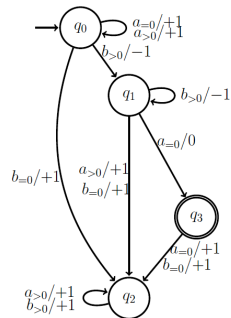


Average number of states in the learnt DROCA

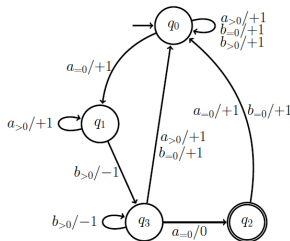


Average number of equivalence queries used for learning

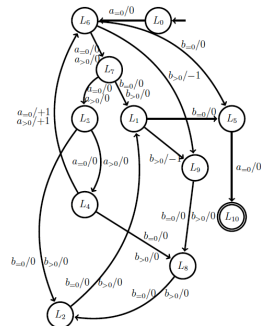
# Example-1: DROCAs learnt by minOCA and BPS



(a) Input **DROCA**



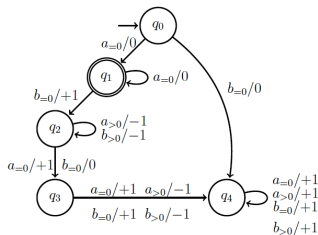
(b) Learnt by **MinOCA**



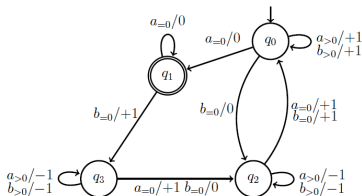
(c) Learnt by **BPS**

The input **DROCA** recognises the language  $\{a^n b^n a \mid n > 0\}$ .

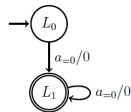
## Example-2: DROCAs learnt by minOCA and BPS



(a) Input DROCA



(b) Learnt by minOCA



(c) Learnt by BPS

The input DROCA recognises the language  $\{w \in \{a, b\}^* \mid w \text{ does not contain a } b\}$ .

# Summary

- Active learning of DROCAAs.
  - Three types of queries used: membership, counter value query, and minimal-equivalence query.
  - Existing algorithms for active learning of DROCAAs need exponentially many queries.
- We proposed an active learning algorithm (MinOCA).
  - MinOCA is in  $P^{NP}$  — queries the teacher polynomial number of times.
  - Learns a minimal counter-synchronous DROCA.
  - Learns DROCAAs of size up to size 10 in 5 minutes — better than existing technique.

# Future Work

- Major bottleneck for practical applications is the equivalence check of DROCAs.
  - Can we improve this?
- Bottleneck for using MinOCA is finding the minimal separating DFA.
  - We can have a faster algorithm, if there is a better way to find the separating DFA.
- Does there exists a polynomial time algorithm for learning DROCAs theoretically?

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- Does there exists a polynomial time algorithm for learning DROCAs theoretically? **Yes.**



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  - We can have a faster algorithm, if there is a better way to find the separating DFA.
- Does there exists a polynomial time algorithm for learning DROCAs theoretically? **Yes.**

Learning Deterministic One-Counter Automata in Polynomial Time  
<https://arxiv.org/abs/2503.04525>  
LICS 2025 (to appear)

# References



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**Thank You !**

# Learning Real-Time One-Counter Automata Using Polynomially Many Queries

[https://doi.org/10.1007/978-3-031-90643-5\\_14](https://doi.org/10.1007/978-3-031-90643-5_14)

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Hamilton, Canada