# Two-Dimensional Automata Theory: Decidability, Complexity, and Algorithms One FLAT World Seminar

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Background Two-Dimensional Automata Restricted 2D Automata

Decidability and Undecidability

Language Operations Concatenation Projection

State Complexity

Algorithms

Polynomial Randomized Approximations

Conclusions

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### Two-Dimensional Automata



- A two-dimensional (2D) automaton is a generalization of a one-dimensional automaton.
- ► Two major differences:
  - 1. Different input word
  - 2. Different transition function

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#	#	#	•••	#	#
#	$a_{1,1}$	a <sub>1,2</sub>	• • •	a <sub>1,n</sub>	#
#	a <sub>2,1</sub>	<b>a</b> 2,2	•••	<b>a</b> <sub>2,n</sub>	#
÷	÷	÷	·	÷	÷
#	$a_{m,1}$	a <sub>m,2</sub>	•••	$a_{m,n}$	#
#	#	#	•••	#	#

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### Two-Dimensional Automata



- A two-dimensional (2D) automaton is a generalization of a one-dimensional automaton.
- ► Two major differences:
  - 1. Different input word
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$$\begin{split} \delta &: (Q \setminus q_{\mathsf{accept}}) \times (\Sigma \cup \{\#\}) \quad \delta : (Q \setminus q_{\mathsf{accept}}) \times (\Sigma \cup \{\#\}) \\ &\to Q \times \{U, D, L, R\} \qquad \to 2^{Q \times \{U, D, L, R\}} \end{split}$$

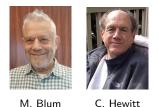
Deterministic four-way (2DFA-4W) Nondeterministic four-way (2NFA-4W)

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# Two-Dimensional Automata: History



 2D automata were introduced by Manuel Blum and Carl Hewitt in 1967.



Work on 2D automata has progressed in "waves" since the introduction of the model.





▶ 2D automata possess a number of useful properties.

Theorem

Nondeterministic 2D automata are more powerful than deterministic 2D automata.

Theorem

Every deterministic 2D automaton can be converted to a halting deterministic 2D automaton.

## Two-Dimensional Automata: Examples

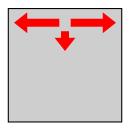


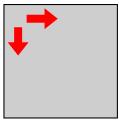
- Much is known about the kinds of languages recognized by 2D automata.
- Deterministic 2D automata:
  - ► Given an m × n input word, does the word contain exactly k occurrences of a given symbol?
  - ▶ Given an *m* × *n* input word, are *m* and *n* coprime?
  - ▶ Given an *n* × *n* input word, is *n* a power of two?
- Nondeterministic 2D automata:
  - ▶ Given an *n* × *n* input word where *n* is odd, does the word contain a 1 as its center symbol?
  - ► Given an n × n input word where n is odd, is the word symmetric about its center column?
- Unknown:
  - Can deterministic 2D automata recognize the language of unary p × p words where p is prime?

## Restricted 2D Automata



- > 2D automata do not have to be **four-way automata**.
  - In fact, four-way automata can sometimes be undesirable, since they're Turing-equivalent.
- Restrict the transition function to get:
  - ▶ Three-way (3W) automata: {D, L, R}
  - Two-way (2W) automata:  $\{D, R\}$
- Three-way automata cannot return to a row after moving downward, but they can read symbols multiple times in a row.
- ► Two-way automata are "read-once".

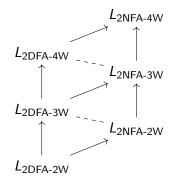




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#### 2D Automata Hierarchy





 $L_A \rightarrow L_B$  indicates  $L_A \subset L_B$ .  $L_A$  - -  $L_B$  indicates  $L_A$  and  $L_B$  are incomparable.



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## **Decision Problems**



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- Many of the classic decision problems for 1D languages can be adapted for 2D languages as well.
- ► Some common decision problems for two 2D languages L(A) and L(B):
  - Membership:  $w \in L(\mathcal{A})$  for some 2D word w
  - Emptiness:  $L(A) = \emptyset$
  - Universality:  $L(A) = \Sigma^{**}$  (the set of all 2D words)
  - Equivalence: L(A) = L(B)
  - Inclusion:  $L(A) \subseteq L(B)$
  - ▶ Disjointness:  $L(A) \cap L(B) = \emptyset$



	2DFA-4W	2NFA-4W	2DFA-3W	2NFA-3W	2DFA-2W	2NFA-2W
membership	1	1	1	1	1	1
emptiness	×	×	1	$\checkmark$	$\checkmark$	$\checkmark$
universality	×	×	1	×	1	X
equivalence	X	×	?	×	$\checkmark$	×
inclusion	×	×	×	×	$\bigcirc$	X
disjointness	×	×	×	×	$\checkmark$	?

T. J. Smith and K. Salomaa. Decision problems and projection languages for restricted variants of two-dimensional automata. *Theoret. Comput. Sci.* 870:153–164, 2021.



	2DFA-4W	2NFA-4W	2DFA-3W	2NFA-3W	2DFA-2W	2NFA-2W
membership	1	1	1	1	1	1
emptiness	×	×	1	$\checkmark$	$\checkmark$	$\checkmark$
universality	×	×	1	×	1	X
equivalence	X	×	?	×	$\checkmark$	×
inclusion	×	×	×	×	$\checkmark$	X
disjointness	X	×	×	×	$\checkmark$	?

**Open problems:** Are the question marks  $\checkmark$  or  $\checkmark$ ?

T. J. Smith and K. Salomaa. Decision problems and projection languages for restricted variants of two-dimensional automata. *Theoret. Comput. Sci.* 870:153–164, 2021.



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- We can also apply the standard 1D language operations to 2D languages.
- ► Some of these operations can be applied as-is:
  - Union:  $L_1 \cup L_2$
  - Intersection:  $L_1 \cap L_2$
  - ► Complement: *L*

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  - ► Concatenation: L<sub>1</sub> ∘ L<sub>2</sub> places all words in L<sub>1</sub> adjacent to all words in L<sub>2</sub> in some way
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  - **Reversal:**  $L^{R}$  reverses the order of the rows in all words of L
- Still other operations are unique to two dimensions:
  - **Rotation:**  $L^{\circlearrowright}$  rotates all words in L by 90° clockwise
  - ► Row Closure: L<sup>⊖</sup> concatenates L with itself row-wise i ≥ 1 times.
  - ► Row Cyclic Closure: Rearrange the top k rows of each word in L to be shifted to the bottom for some 1 ≤ k ≤ # of rows.



	2DFA-4W	2NFA-4W	2DFA-3W	2NFA-3W	2DFA-2W	2NFA-2W
U	✓	✓	×	1	×	$\checkmark$
$\cap$	1	1	×	×	×	×
	1	×	1	×	$\checkmark$	X

T. J. Smith and K. Salomaa. Recognition and complexity results for projection languages of two-dimensional automata. *J. Autom. Lang. Comb.* 28(1–3):201–220, 2023.



- Let's focus on "the" concatenation operation  $L_1 \circ L_2$ .
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$$w \ominus v = \frac{w_{1,1} \cdots w_{1,n}}{v_{1,1} \cdots v_{m,n}}$$
$$\vdots \cdots \vdots$$
$$w_{m,1} \cdots v_{1,n}$$
$$\vdots \cdots \vdots$$
$$v_{m',1} \cdots v_{m',n}$$



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- We can concatenate 2D words in two different ways: row-wise or column-wise.

$$w \oplus v = \begin{array}{cccc} w_{1,1} \cdots & w_{1,n} & v_{1,1} \cdots & v_{1,n'} \\ \vdots & \vdots & \vdots & \vdots & \vdots \\ w_{m,1} \cdots & w_{m,n} & v_{m,1} \cdots & v_{m,n'} \end{array}$$



- Let's focus on "the" concatenation operation  $L_1 \circ L_2$ .
- We can also concatenate two 2D words **diagonally**.



	2DFA-4W	2NFA-4W	2DFA-3W	2NFA-3W	2DFA-2W	2NFA-2W
U	1	1	×	1	×	1
$\cap$	1	1	×	×	×	×
_	1	×	1	×	1	×
$\ominus / \oplus$	×	×	×	$\checkmark_{\ominus}$ $\aleph_{\oplus}$	×	×
$\oslash$	?	?	X	?	۲	$\checkmark$

(2NFA-2W is closed under ⊖ and  $\oplus$  for unary alphabets.)

T. J. Smith and K. Salomaa. Concatenation operations and restricted variants of two-dimensional automata. In Proc. of SOFSEM 2021, pages 147-158, 2021. ▲□▶ ▲□▶ ▲三▶ ▲三▶ - 三 - のへぐ



	2DFA-4W	2NFA-4W	2DFA-3W	2NFA-3W	2DFA-2W	2NFA-2W
U	1	1	×	1	×	1
$\cap$	1	1	×	×	×	×
	1	×	1	×	1	×
$\ominus / \oplus$	×	×	×	$\checkmark_{\ominus}$ $\aleph_{\oplus}$	×	×
$\oslash$	?	?	X	?	۲	$\checkmark$

(2NFA-2W is closed under  $\ominus$ and  $\oplus$  for unary alphabets.)

**Open problems:** Are the question marks  $\checkmark$  or  $\cancel{X}$ ?

T. J. Smith and K. Salomaa. Concatenation operations and restricted variants of two-dimensional automata. In *Proc. of SOFSEM 2021*, pages 147–158, 2021.

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	2DFA-4W	2NFA-4W	2DFA-3W	2NFA-3W	2DFA-2W	2NFA-2W
U	1	1	×	1	×	1
$\cap$	1	1	×	×	×	×
_	1	×	1	×	1	×
$\ominus / \oplus$	×	×	×	<b>√</b> ⊖ <b>X</b> ⊕	×	×
$\oslash$	?	?	×	?	×	1
R	1	1	×	1	×	×
Ŏ	1	1	×	×	×	×
row/column closure	×	×	×	<b>√</b> <sub>R</sub> <b>×</b> <sub>C</sub>	۲	۲
row/column cyclic closure	×	×	×	×	۲	×

T. J. Smith. Closure, Decidability, and Complexity Results for Restricted Variants of Two-Dimensional Automata. Doctoral thesis, Queen's University, 2021.

# **Projection Operations**



- We can project 2D words onto one dimension to produce classical string languages.
- The row/column projection of a 2D language L is the 1D language consisting of all first rows/first columns of all 2D words in L.

$$w = \begin{array}{ccc} w_{1,1} \cdots & w_{1,n} \\ \vdots & \ddots & \vdots \\ w_{m,1} \cdots & w_{m,n} \end{array}$$

$$pr_{R}(w) = w_{1,1}w_{1,2}\cdots w_{1,n}$$
  
 $pr_{C}(w) = w_{1,1}w_{2,1}\cdots w_{m,1}$ 

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## Projection Operations: Space Complexity



	$\mid \mathcal{A}$	$pr_{R}(\mathcal{L}(\mathcal{A}))$	$pr_{C}(\mathcal{L}(\mathcal{A}))$
	-4W	(NSPACE(O(n)))	(NSPACE(O(n)))
General	-3W	DSPACE(O(1))	?
	-2W	DSPACE(O(1))	DSPACE(O(1))
	-4W	?	?
Unary	-3W	DSPACE( <i>O</i> (1))	$(\leq NSPACE(O(log(n))))$
	-2W	DSPACE(O(1))	DSPACE(O(1))

Recall that:

- REG = DSPACE(O(1)).
- ► CSL = NSPACE(O(n)).

T. J. Smith and K. Salomaa. Recognition and complexity results for projection languages of two-dimensional automata. J. Autom. Lang. Comb. 28(1-3):201-220, 2023.

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**Open problems:** What is the space complexity of each of the question mark entries?

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- ▶ Why should we care about projections from 2D to 1D?
- Observe all of the 2D projection language classes that are in DSPACE(O(1)):
  - 2DFA-3W row projection
  - ► 2DFA-3W-1∑ row projection
  - 2DFA-2W and 2NFA-2W row/column projection
  - ▶ 2DFA-2W-1 $\Sigma$  and 2NFA-2W-1 $\Sigma$  row/column projection
- Since each of these projection languages is regular, we can apply standard techniques and obtain state complexity results for these languages.



State complexity tradeoff:

• *n*-state 2NFA-2W  $\rightarrow$  NFA:

 $(2n-1) \le \mathsf{nsc}(\cdot) \le (2n)$ 

Operational state complexity:

▶  $\operatorname{pr}_{\mathsf{R}}(L(\mathcal{A}) \cup L(\mathcal{B}))$  for 2NFA-2W:  $(2(m+n-1)) \leq \operatorname{nsc}(\cdot) \leq (2(m+n+1))$ 

▶ 
$$\operatorname{pr}_{\mathsf{R}}(L(\mathcal{A}) \oslash L(\mathcal{B}))$$
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#### Open problem: Can these bounds be tightened?

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Open problem: Can these bounds be tightened?

**Open problem:** What bounds exist for other 2D language operations and models?

T. J. Smith and K. Salomaa. Recognition and complexity results for projection languages of two-dimensional automata. J. Autom. Lang. Comb. 28(1-3):201-220, 2023.



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#### Decision Problems Revisited



#### ▶ Recall some decision problems for 2D automaton models:

- ▶ 2DFA-4W: emptiness undecidable, universality undecidable.
- ▶ 2NFA-4W: emptiness undecidable, universality undecidable.
- ► 2DFA-3W: emptiness **decidable**, universality **decidable**.
- ► 2NFA-3W: emptiness **decidable**, universality undecidable.
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- ► 2NFA-2W: emptiness **decidable**, universality undecidable.
- ► For every 2D automaton model, membership is decidable.
  - ► In fact, membership is in NL.

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- 2NFA-2W: emptiness decidable, universality undecidable.
- ► For every 2D automaton model, membership is decidable.
  - In fact, membership is in NL.
- However, emptiness and universality for restricted 2D automata are PSPACE-hard.

T. J. Smith. Closure, Decidability, and Complexity Results for Restricted Variants of Two-Dimensional Automata. Doctoral thesis, Queen's University, 2021.



- How might we get answers to these decision problems more efficiently?
  - Use randomization and approximation!





- How might we get answers to these decision problems more efficiently?
  - Use randomization and approximation!
- Polynomial randomized approximation (PRAX) algorithms were introduced by Konstantinidis et al. to decide approximate versions of NFA decision problems.
- ► Key idea:
  - Treat the decision problem as an estimation of the parameter of some population.
  - Use existing parameter estimation tools to obtain approximate solutions.

S. Konstantinidis et al. Approximate NFA universality and related problems motivated by information theory. *Theoret. Comput. Sci.* 972:114076, 2023.



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- ► Goal:
  - ► Take a (possibly infinite) subset L of an infinite domain X and test whether L is e-close to being empty or full for some e ∈ (0, 1).



- ► Goal:
  - ► Take a (possibly infinite) subset L of an infinite domain X and test whether L is e-close to being empty or full for some e ∈ (0, 1).
- Technical points:
  - How do we sample from a finite distribution? Take the distribution to be polynomially samplable.
  - How do we sample from an infinite distribution? Take the distribution to be tractable: use an algorithm to "cut" the infinite tail such that the remaining finite events can be sampled within a tolerance δ of the infinite distribution.
  - How many samples are sufficient?
     A linear amount relative to 1/δ. (Previously quadratic!)

P. Andreou, S. Konstantinidis, and T. J. Smith. Improved randomized approximation of hard universality and emptiness problems. *J. Autom. Lang. Comb.* To appear.



- ► Where have PRAX algorithms been used?
  - Deciding approximate NFA universality.

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S. Konstantinidis et al. On the difference set of two transductions. *Theoret. Comput. Sci.* 1016:114780, 2024.



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  - Deciding approximate NFA universality.
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  - Deciding block NFA universality.
  - Deciding 2D automaton emptiness and universality.
  - Testing whether a CNF formula is a tautology.
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#### Theorem

There exists a PRAX algorithm for the 2D emptiness and universality decision problems (relative to a "2D word" Dirichlet distribution  $\langle D_{t,d}^2 \rangle$ ) that runs in time  $O(1/\epsilon \cdot \sqrt[t-1]{1/\epsilon^2} \cdot s)$ , where s is the number of states of the input 2D automaton.

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Open problem: Where else can we use PRAX algorithms?



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- 2D automata are a natural extension of the finite automaton model, with many different variants or "flavours" possessing different properties.
- Almost no problems are decidable for four-way 2D automata, but more problems are decidable for three- and two-way variants.
- Some language operations have positive closure results for four-way 2D automata, while almost no operations are closed for two-way 2D automata.
- Projection operations allow us to "convert" 2D languages to 1D and apply standard techniques (e.g., state complexity).
- We can obtain approximate solutions to 2D decision problems using PRAX algorithms.

### Future Work



- Resolve the decidability status of the remaining decision problems.
- Resolve the closure status of diagonal concatenation for all 2D models.
- Determine the space complexity of other 2D projection language classes.
- Investigate state complexity bounds for other 2D language operations and models.
- Investigate applications of PRAX algorithms.
- Lots to be done with 2D automata!

#### Shameless Advertisement



# THEORY OF COMPUTING

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# Thank you!



Formal Languages and Automata Research Lab St. Francis Xavier University



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