

# On the Complexity of Language Membership for Probabilistic Words

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## Introduction and Example

We consider **probabilistic words**:

- Probabilistic word  $p$  of length  $n$  over  $\Sigma = \{a, b\}$ : sequence  $p = p_1 \cdots p_n$  of probability distributions over letters of  $\Sigma$ .
  - For instance, for all  $1 \leq i \leq n$ , set  $p_i(a) := 0.6$  and  $p_i(b) := 0.4$
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### Question

Given the probabilistic word  $p$ , compute the probability that a random word generated by  $p$  belongs to  $L$ ? i.e., compute:

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Ex: for  $p$  above and  $L_0$ , we have  $p(L_0) = \sum_{0 \leq j \leq \lfloor n/2 \rfloor} \binom{n}{2j} 0.6^{2j} 0.4^{n-2j}$

# Probabilistic Membership Problem

For any fixed language  $L$ , define the **probabilistic membership problem**  $\#pM(L)$ :

## Problem $\#pM(L)$

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Note: we only study complexity as a function of  $p$ , with  $L$  fixed (= data complexity)

- **Naïve algorithm** (exponential):
  - Consider every possible word  $w = a_1 \cdots a_n$  of  $\Sigma^n$
  - Compute its probability  $p(w) := \prod_{1 \leq i \leq n} p_i(a_i)$
  - Test whether  $w \in L$
  - Sum the  $p(w)$  for all such words

→ **Research question:** For which languages  $L$  is  $\#pM(L)$  in PTIME?

Tractability for Regular Languages and Unambiguous CFLs

Intractability for Some Inherently Ambiguous Context-Free Languages

Other Methods for Tractability

## **Tractability for Regular Languages and Unambiguous CFLs**

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## Tractability for Regular Languages

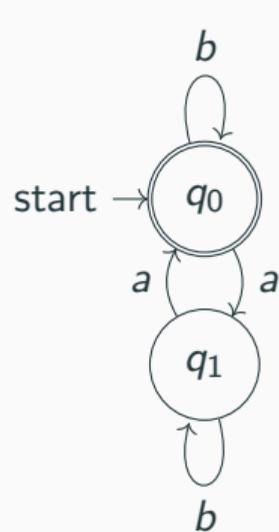
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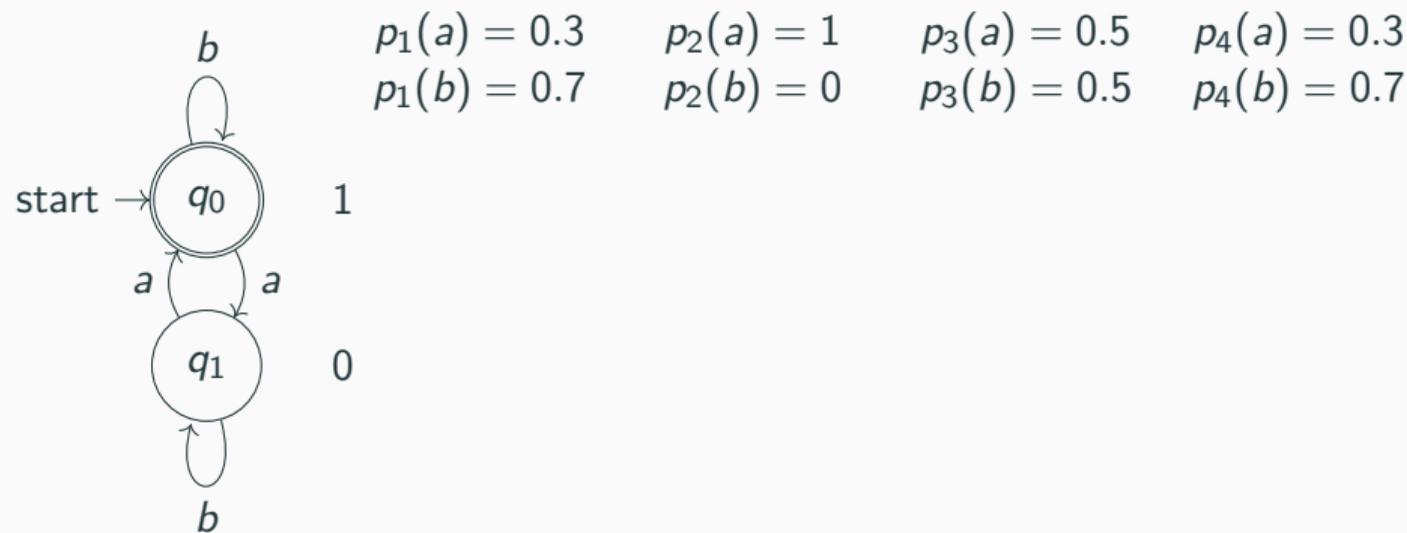


$p_1(a) = 0.3$	$p_2(a) = 1$	$p_3(a) = 0.5$	$p_4(a) = 0.3$
$p_1(b) = 0.7$	$p_2(b) = 0$	$p_3(b) = 0.5$	$p_4(b) = 0.7$

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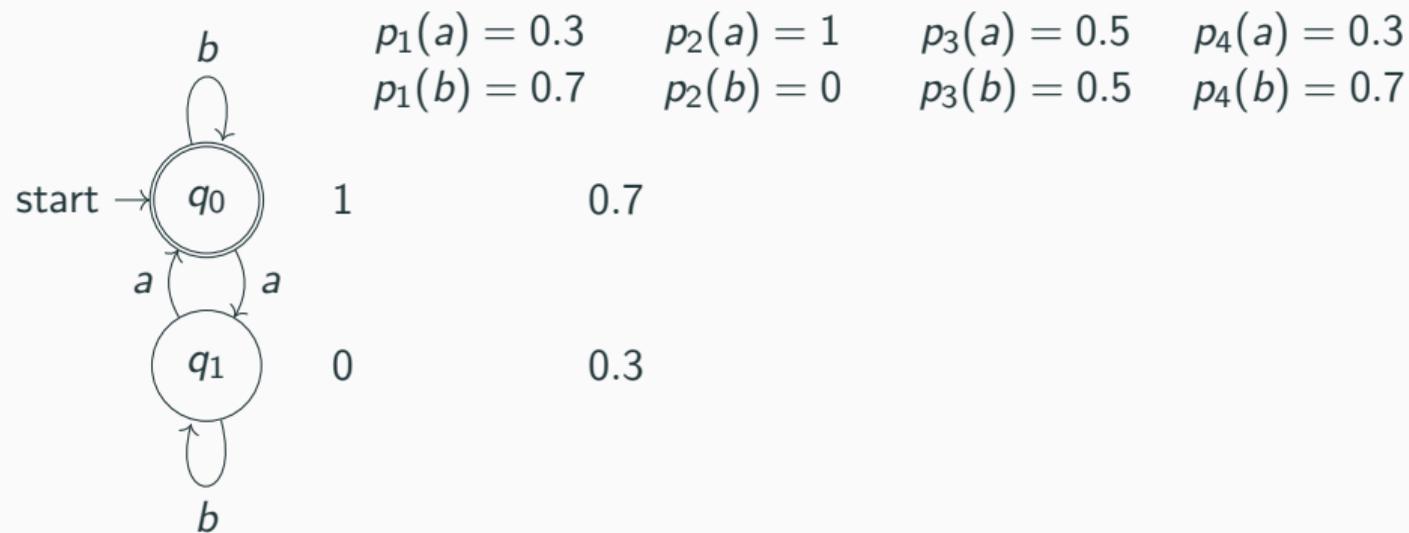
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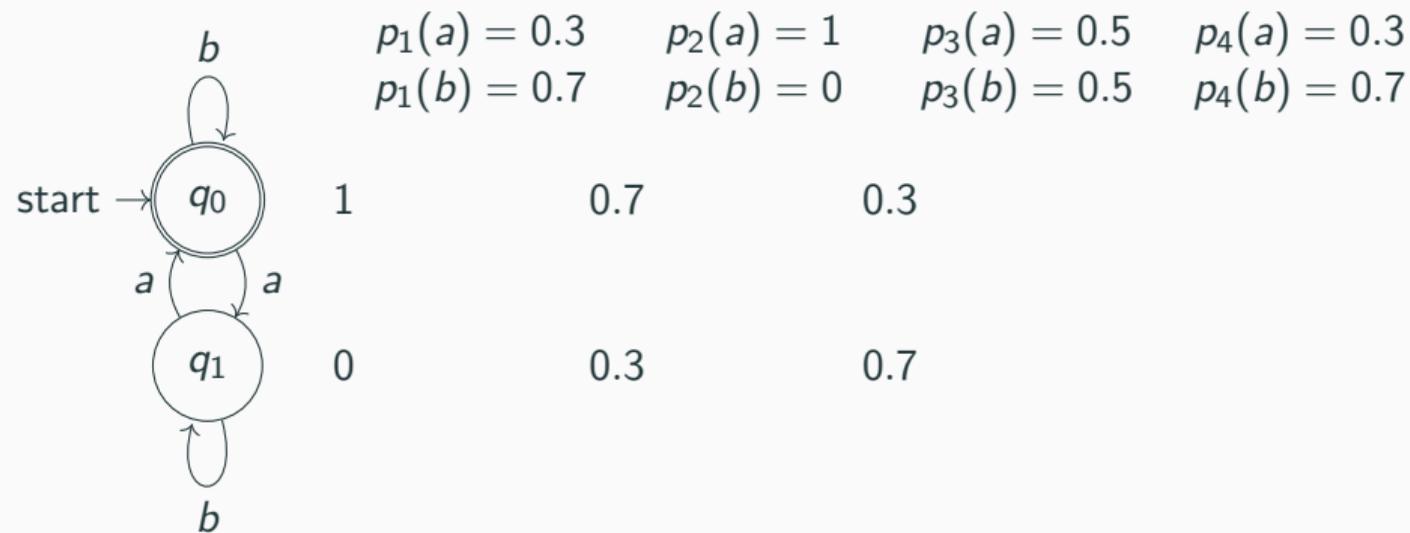
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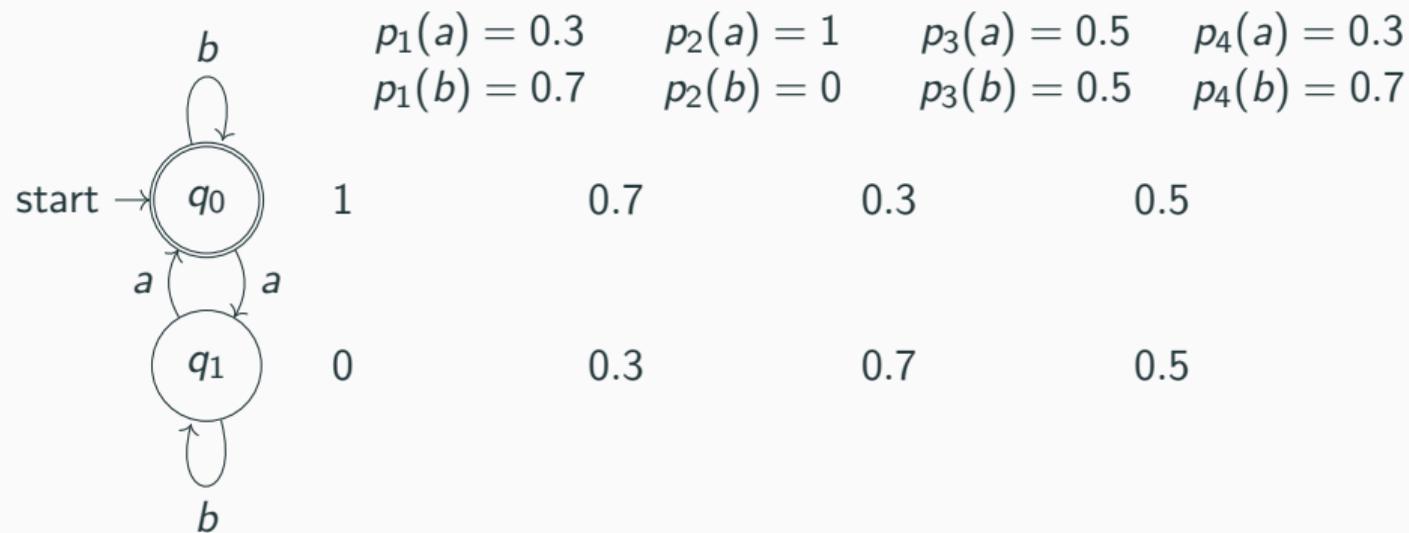
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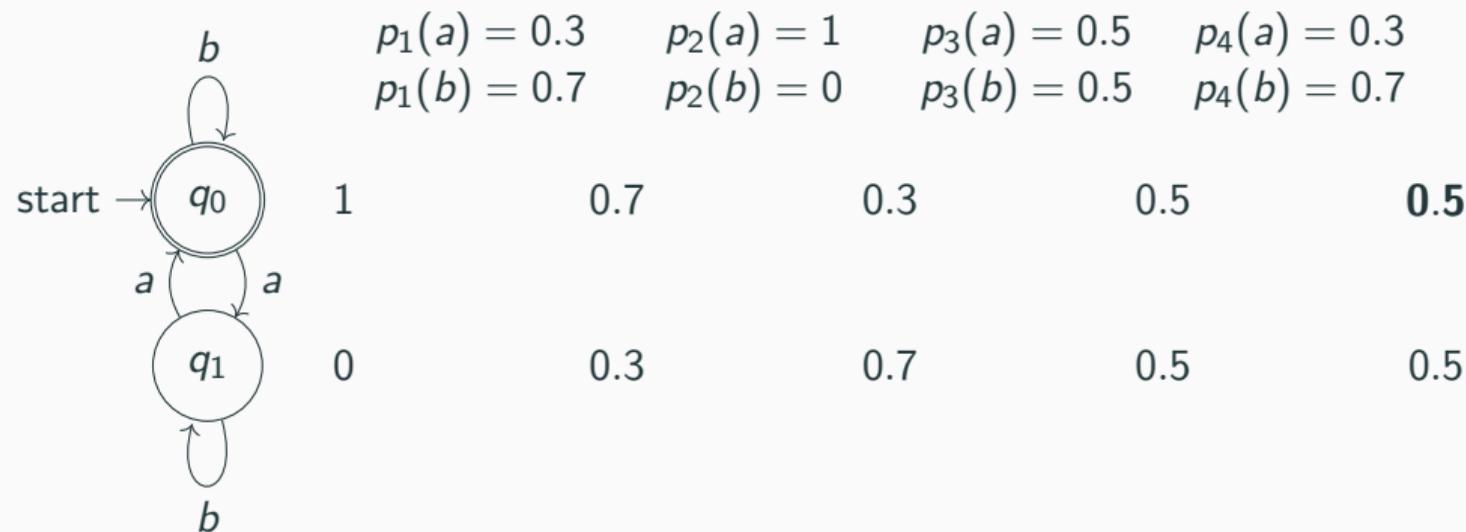
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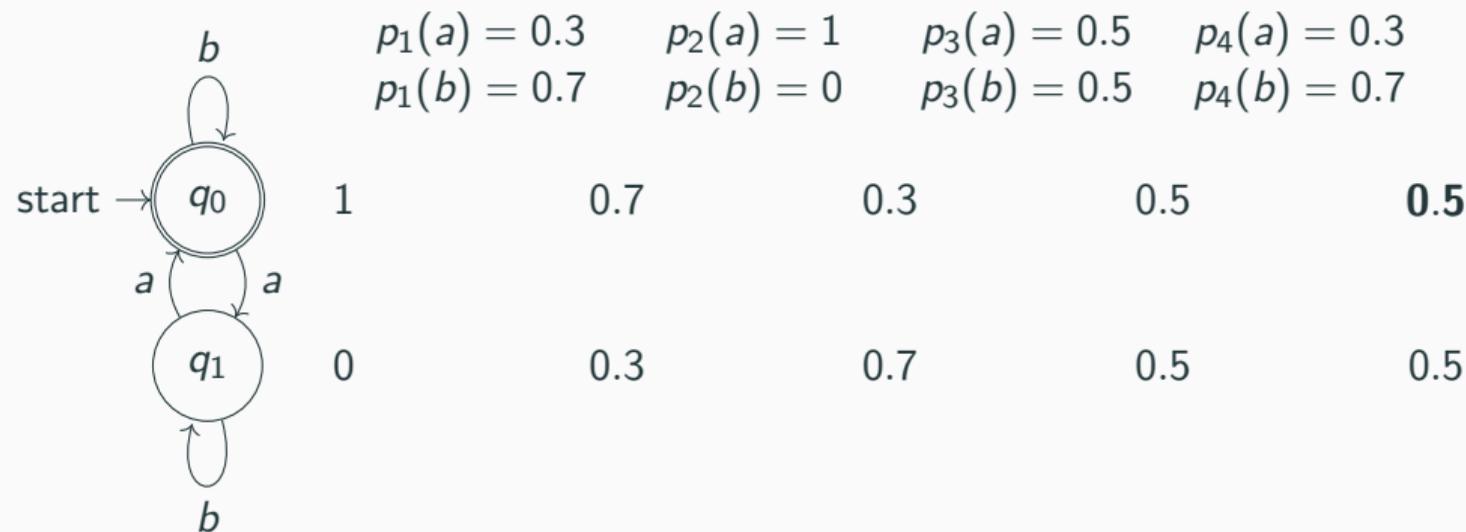
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This even works for unambiguous automata (only one accepting run per word)

## Tractability for UCFG (Result Statement)

We study  $\#pM(L)$  for **context-free languages** (CFL)  $L$ . Recall the definitions:

- A CFL is a language recognized by a **context-free grammar** (CFG):
  - Ex:  $L_1 = \{a^n b^n \mid n \in \mathbb{N}\}$  with the CFG  $G_1$  having productions  $S \rightarrow aSb$  and  $S \rightarrow \varepsilon$
- A word is accepted by  $G$  if it has a **derivation tree**
- A CFG is **unambiguous** (UCFG) if every word has at most one derivation tree
- A CFL is **unambiguous** (UCFL) if it is accepted by a UCFG, otherwise it is **inherently ambiguous**
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  - Example:  $L_1$  is a UCFL

### Theorem

For any UCFL  $L$ , the problem  $\#pM(L)$  is in PTIME

## Tractability for UCFG (Proof Sketch)

- Recall the **CYK** algorithm to test if a word  $w = a_1 \cdots a_n$  is accepted by a CFG  $G$ 
  - Build a table of Booleans  $T[A, i, j]$  indicating whether  $a_i \cdots a_{j-1}$  is derivable from  $A$
  - Inductive case:  $T[A, i, j] = \bigvee_{A \rightarrow BC} \bigvee_{i \leq k \leq j} T[B, i, k] \wedge T[C, k, j]$

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- Generalization on a probabilistic word  $p = p_1 \cdots p_n$ : build a table of rationals  $P[A, i, j]$  indicating the probability that  $p_i \cdots p_{j-1}$  generates a word derivable from  $A$
- Inductive case:  $P[A, i, j] = \sum_{A \rightarrow BC} \sum_{i \leq k \leq j} P[B, i, k] \times P[C, k, j]$
- Uses **independent AND** (disjoint positions) and **exclusive OR** (unambiguity)

# Intractability for Some Inherently Ambiguous Context-Free Languages

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# Hardness for a Fixed Grammar (I)

## Theorem

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- Reduction from the #P-hard problem **#P2DNF**:
  - **Input:** A positive 2-DNF formula  $\phi$ , i.e., a disjunction of terms  $x_i \wedge x_j$
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  - **Output:** The number of valuations that satisfy  $\phi$
- The input words will be of the form:  $p = u \$ v_1^R \$ \dots \$ v_m^R \$$  where
  - $u$  is a uniform probabilistic word coding a valuation
  - $v_i^R$  is (the mirror of) a non-probabilistic word coding the  $i$ -th clause

## Hardness for a Fixed Grammar (II)

Example:  $\phi = (x_1 \wedge x_2) \vee (x_2 \wedge x_3)$

Input words of the form  $p = u \$ v_1^R \$ v_2^R \$$  with:

- $u = u_1 u_2 u_3$  with  $u_i(0) = u_i(1) = 1/2$  for each  $i$
- $v_1 = 110$  and  $v_2 = 011$
- A valuation  $u'$  of  $u$  satisfies  $v_1$  if  $u'[1] = 1$  and  $u'[2] = 1$ , i.e.,  $v_1 \leq_{\text{componentwise}} u$

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Thus:  $\#pM(L_0)$  is  $\#P$ -hard for the language  $L_0$  over  $\Sigma = \{\$, 0, 1\}$  defined as:

$$L_0 := \{ u \$ \Sigma^* \$ v^R \$ \Sigma^* \mid u, v \in \{0, 1\}^* \text{ with } v \leq_{\text{componentwise}} u \}$$

$L_0$  can be recognized by a nondeterministic pushdown automaton

## 1. The union of 2 UCFGs can be #P-hard

- Encode the run of a polynomial-time nondeterministic Turing Machine:
  - One CFG accepts if an error occurs on an even step
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⇒ Is #pM( $L$ ) hard for all inherently ambiguous CFLs  $L$ ?

## Other Methods for Tractability

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# Poly-Slicewise-Unambiguous Languages

$L$  is **poly-slicewise-unambiguous** if, for each length  $n$ , we can compute in PTIME a UCFG capturing  $L \cap \Sigma^n$

## Theorem

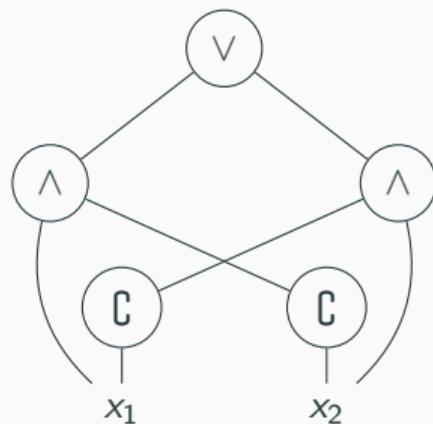
*If  $L$  is poly-slicewise-unambiguous, then  $\#_pM(L)$  is in PTIME*

## Consequences:

- $\#_pM$  is tractable for **polyslender / bounded CFLs**
  - Polyslender = number of words of length  $n$  is polynomial in  $n$
  - The UCFG for length  $n$  just generates each word explicitly
  - Covers some inherently ambiguous CFLs, e.g.,  $\{a^i b^j c^k \mid i = j \vee j = k\}$
- $\#_pM$  is tractable for **unambiguous polynomial-time counter automata**
  - In particular: VASS, Parikh automata, one-counter automata, etc.
  - By contrast nondeterministic counter automata may be hard (previous slide)

# Tractable Circuits

**Boolean circuit  $C$**  over variables  $x_1, \dots, x_n$ : directed acyclic graph (DAG) with  $\wedge$  /  $\vee$  /  $\neg$  gates (AND, OR, negation).

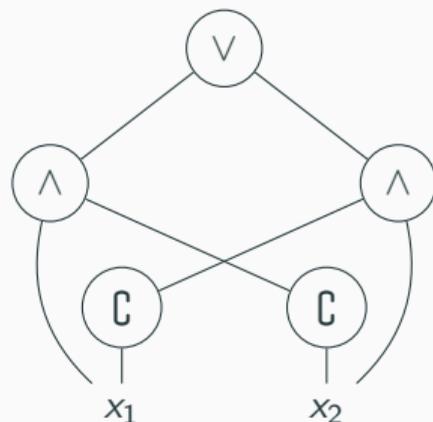


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$$L(C) = \{ w \in \{0, 1\}^n \mid C(w) = 1 \}.$$



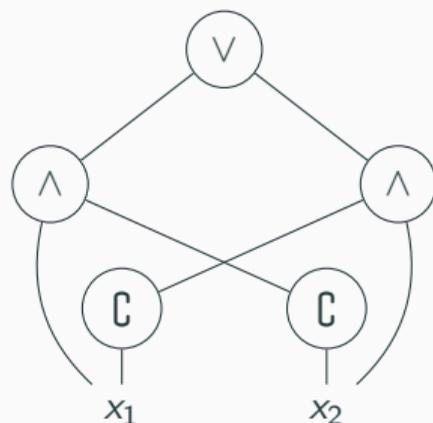
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$$L(C) = \{w \in \{0, 1\}^n \mid C(w) = 1\}.$$

$\#pM(L(C))$  then amounts to computing the probability that  $C$  evaluates to true (but this may be  $\#P$ -hard)



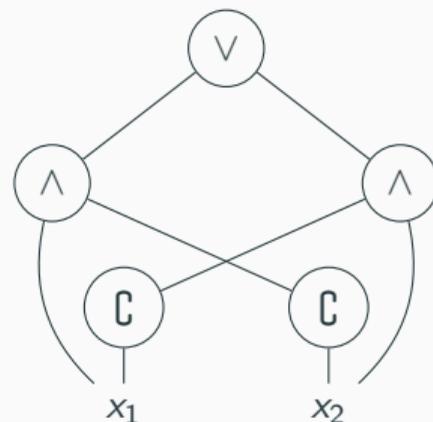
# Tractability of Circuits

On which circuits  $C$  can we tractably compute the probability that  $C$  is true?

## Tractable circuits

A circuit is **tractable** when:

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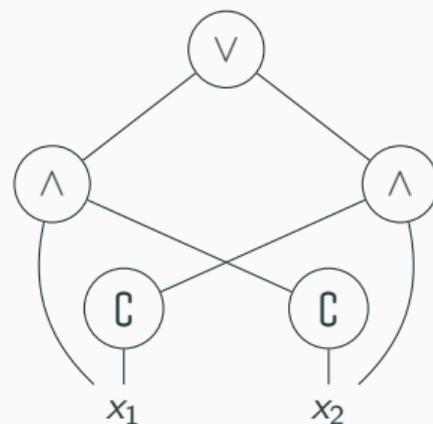
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## Theorem

*Given a tractable circuit  $C$  on inputs  $x_1, \dots, x_n$  and a probabilistic word  $p = (p_1, \dots, p_n)$ , we can solve  $\#pM(L(C))$  in linear time (up to arithmetic costs)*



## Grammars vs Circuits

- Given a CFL  $L$  recognized by CFG  $G$  and length  $n$  we can build in PTIME a circuit  $C_n$  with  $L(C^n) = L \cap \Sigma^n$ 
  - Proof: Trace of the CYK algorithm
- If the grammar is unambiguous, then we get a tractable circuit
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  - If  $L$  is poly-slicewise-unambiguous, then we can also build tractable circuits
  - The converse is known to be false:  $\{\Sigma^k a \Sigma^{n-1} a \Sigma^{n-1-k} \mid k \leq n-1\}$ 
    - has tractable circuits, but not poly-slicewise-unambiguous
    - see [Mengel and Vinall-Smeeth, PODS'25]
- ⇒ Intuition: tractable circuits allow an arbitrary reading order (vs left-to-right order for poly-slicewise-unambiguous)

## Application to $\text{PAL}^2$

$\text{PAL}^2$  is the set of words of the form  $w = w_1w_2$  where  $w_1$  and  $w_2$  are palindromes

### Theorem

*$\#pM(\text{PAL}^2)$  can be solved in  $O(n^3)$  by building tractable circuits*

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### Proof idea

- Key combinatorial lemma: The primitive root of any word in  $\text{PAL}^2$  decomposes uniquely into two palindromes
- Then do a downward induction based on the **order** of the word
- Use subset difference to do inclusion-exclusion reasoning
- Same technique can show tractability of  $\#pM$  for the language of primitive words

## Conclusion

- We studied probabilistic membership  $\#_pM(L)$  for CFLs
- The problem is tractable for:
  - Unambiguous CFLs
  - Poly-slicewise-unambiguous languages, including polyslender languages and unambiguous polynomial-time counter automata
  - Languages with tractable  $\times, \uplus, \mathcal{C}$ -circuits, including primitive words and  $PAL^2$
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## Future directions

- Classify more CFLs (e.g.,  $PAL^k$ ,  $PAL^*$ , etc.)
- Are tractable circuits with negation more powerful than without?
- Study combined complexity, with the automaton/CFG also given as input
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**Thanks for your attention!**

# Tractability for Primitive Words (Result)

## Definition

A word  $w \in \Sigma^*$  is *primitive* if it is not a proper power:

$$w \neq u^k \quad \text{for any } u \in \Sigma^*, k \geq 2.$$

Let  $L_{\text{prim}}$  be the language of primitive words.

## Theorem

*The problem  $\#_{\text{PM}}(L_{\text{prim}})$  can be solved in time  $O(n^2)$*

Note that it is not known whether  $L_{\text{prim}}$  is context-free

# Tractability for Primitive Words (Proof Sketch)

## Root and order

Every  $u \neq \varepsilon$  can be uniquely written as  $u = w^d$  where  $w$  is primitive (the root) and  $d \geq 1$  is the order.

Define:

$$L_k = \{\text{words of order } k\}, \quad M_k = \{v^k \mid v \in \Sigma^*\}.$$

Note that  $M_k$  is the set of words whose order is a multiple of  $k$ .

**Step 1:** Build circuits for  $M_k$  (with  $k \mid n$ )

- Enforce periodicity: test that we have the same letter at each offset
- Product over offsets, union over letters, product over positions having that offset

**Step 2:** Recover  $L_1 = L_{\text{prim}}$  by

$$M_k = \bigcup_{d \geq 1} L_{dk}$$

Downward induction, and subset difference via complementation:  $V \setminus U = \mathbb{C}((\mathbb{C}V) \uplus U)$