

Catalytic approaches to the Tree Evaluation Problem

James Cook, Ian Mertz

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Outline

The Tree Evaluation Problem

New algorithm

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Pebbles and Branching Programs for Tree Evaluation [S. Cook, P. McKenzie, D. Wehr, M. Braverman, R. Santhanam 2010]

New Results for Tree Evaluation [S. Chan, J. Cook, S. Cook, P. Nguyen, D. Wehr 2010]

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Motivation and definition

Branching programs and pebbling games

Lower bounds

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The Tree Evaluation Problem (TEP)

Motivation

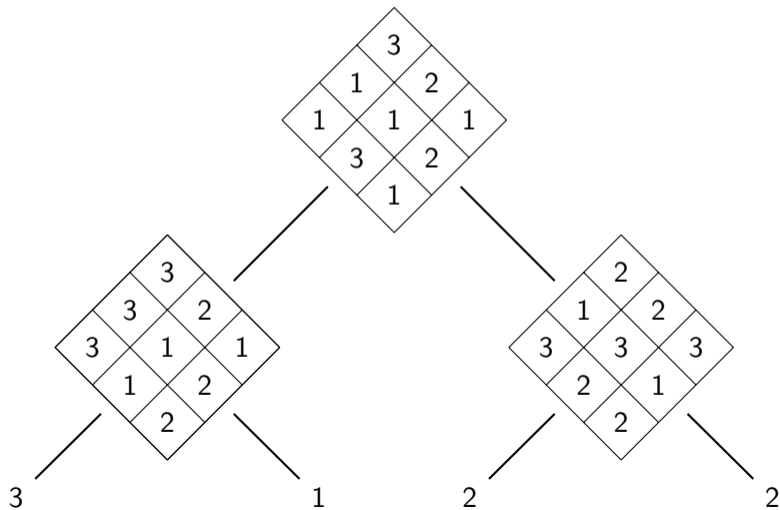
Fact

$\text{TEP} \in \text{P}$

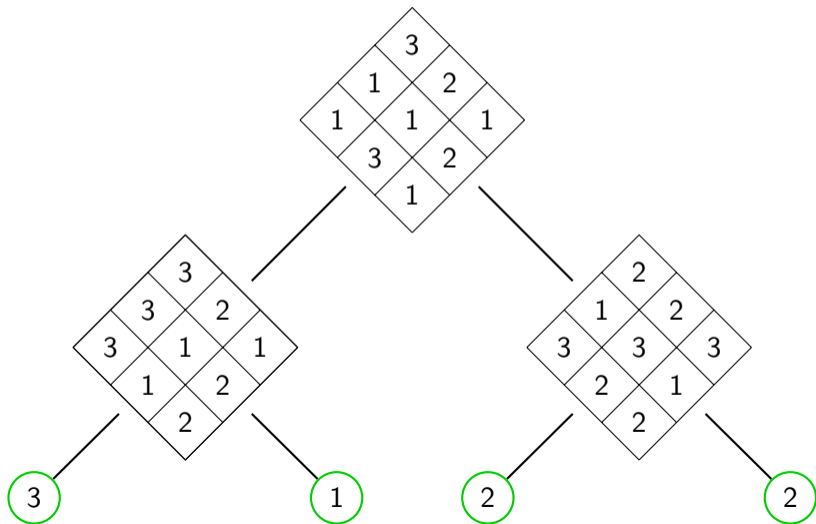
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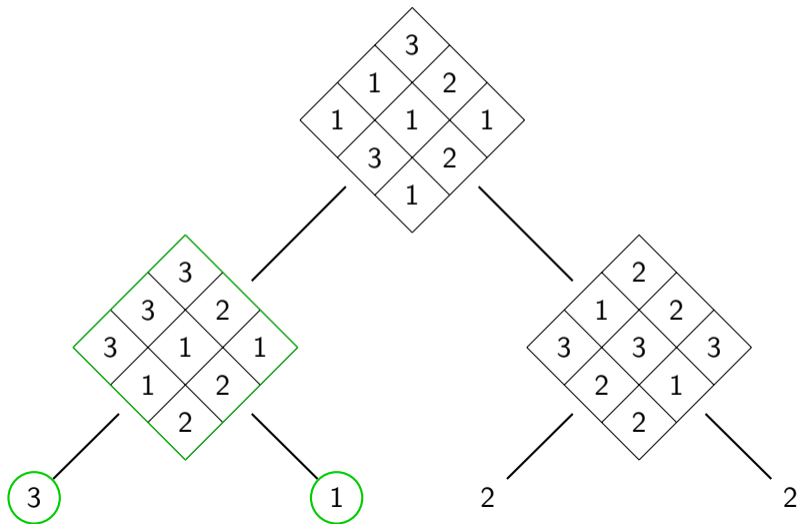
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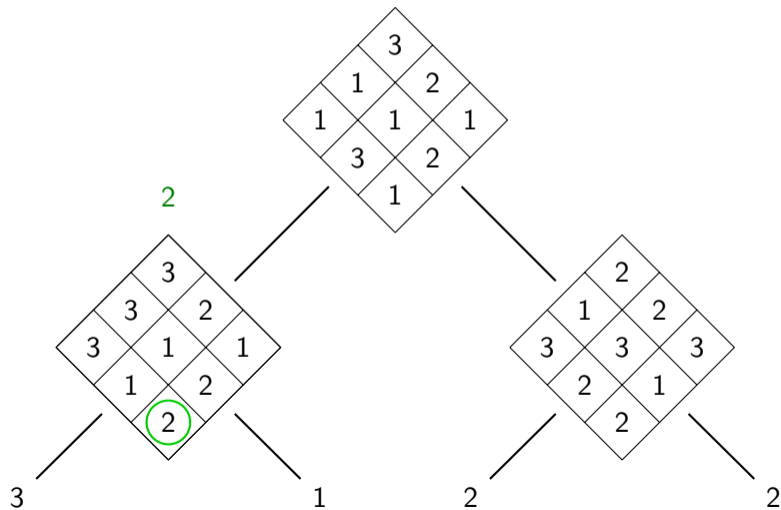
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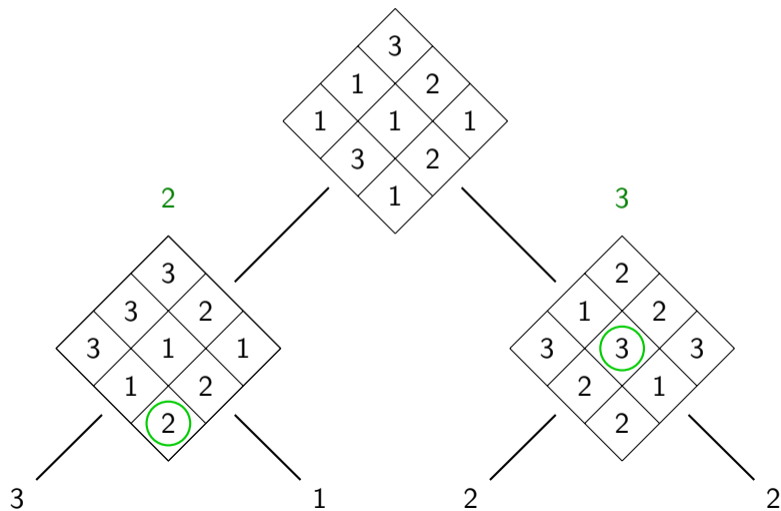
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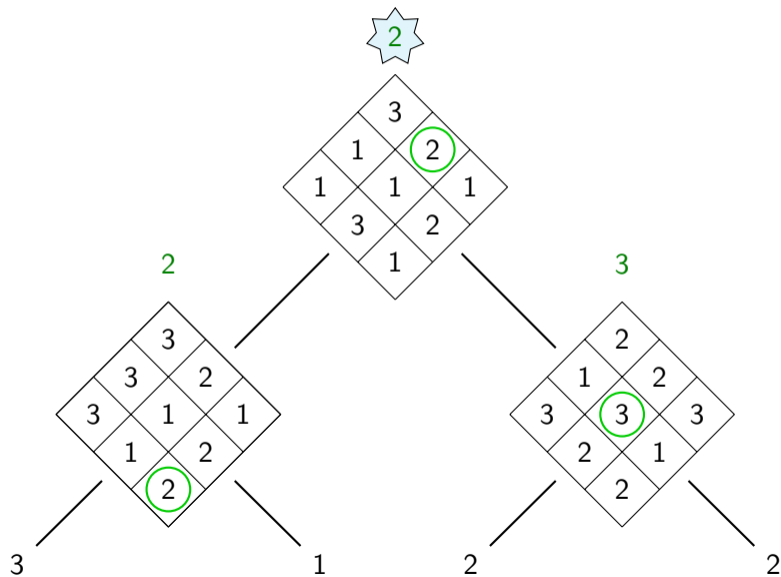
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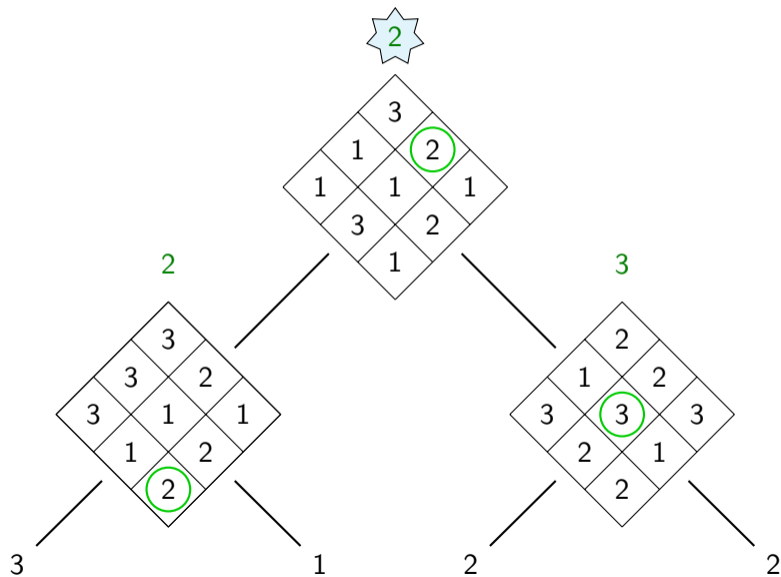
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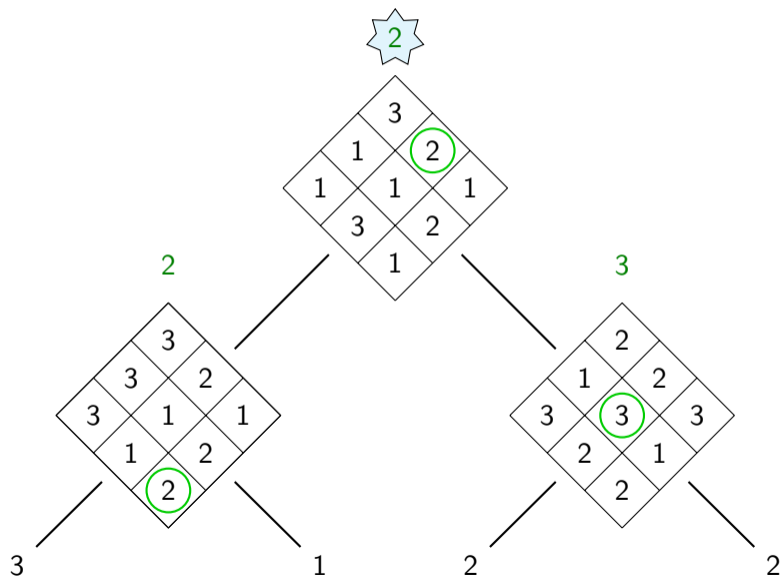
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$$n = \Theta(2^h k^2 \log k) \text{ bits.}$$

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TEP \notin L

In other words, it can't be solved in $O(h + \log k)$ space.

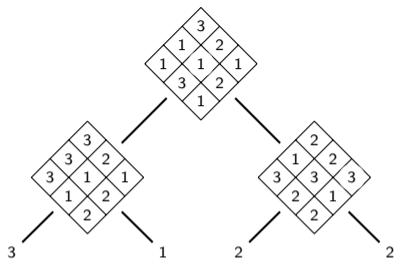
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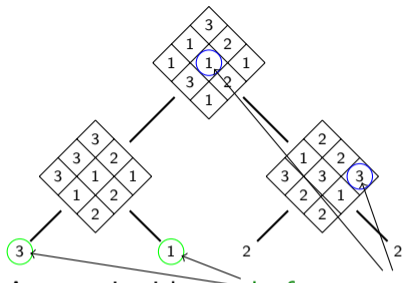
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Branching programs and pebbling games

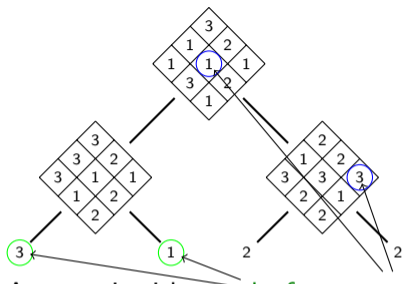
Lower bounds

New algorithm





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A *branching program* is a directed graph of *states*. There are two kinds of state:

- ▶ *query state*: labelled with a query and has k outgoing edges labelled with the possible answers.
- ▶ *final state*: labelled with a number $1..k$.

One state is the starting state.

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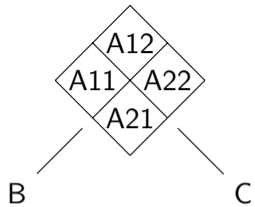
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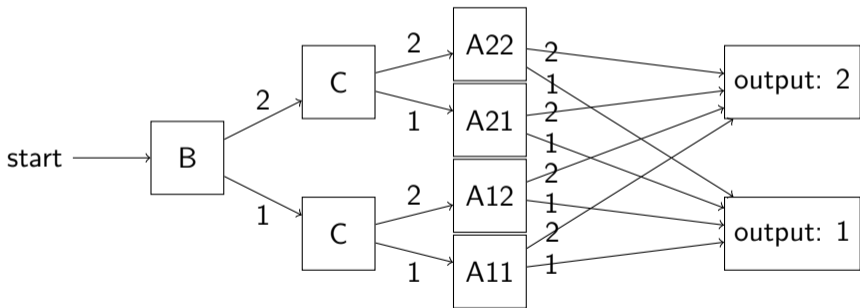
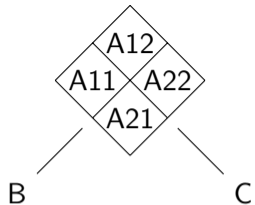
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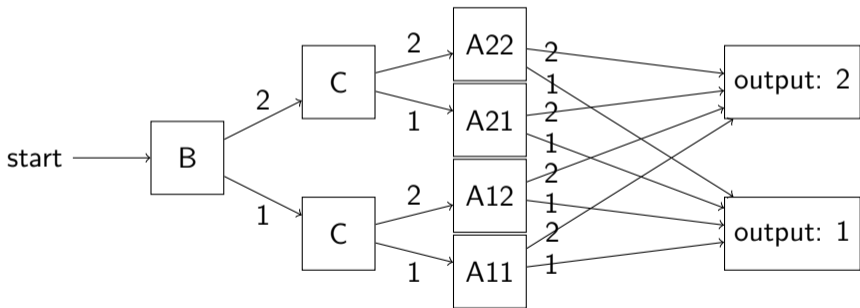
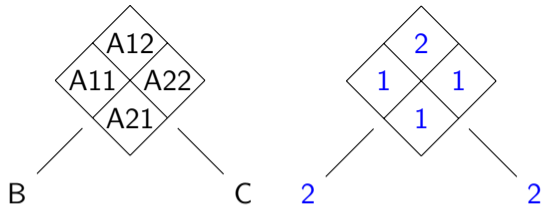
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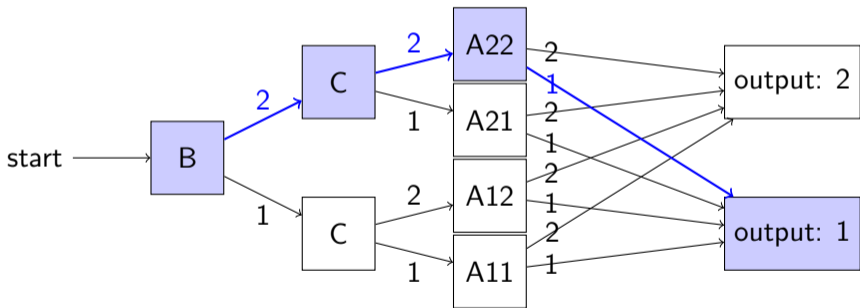
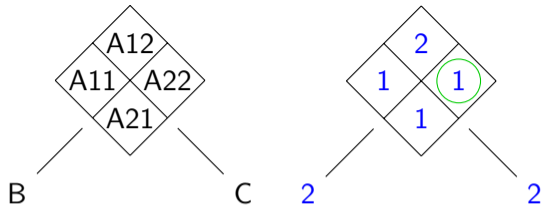
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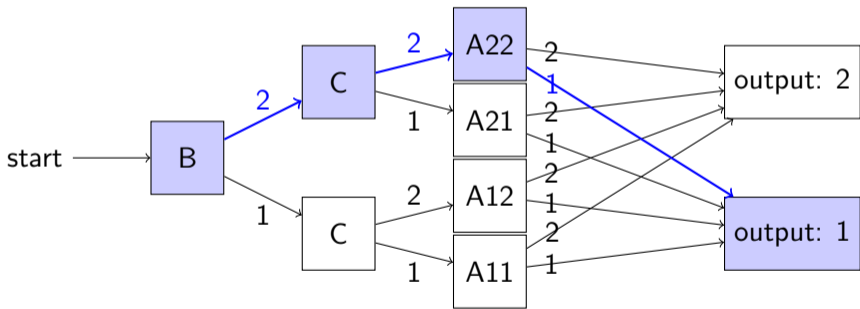
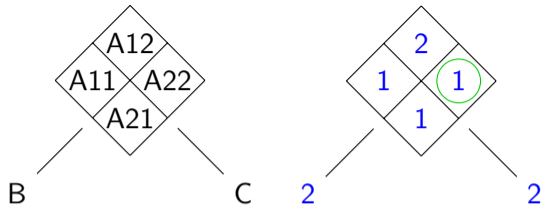
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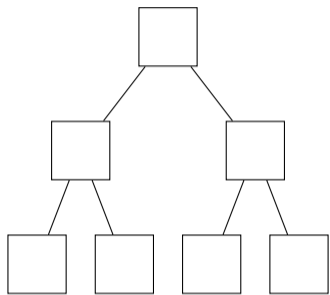


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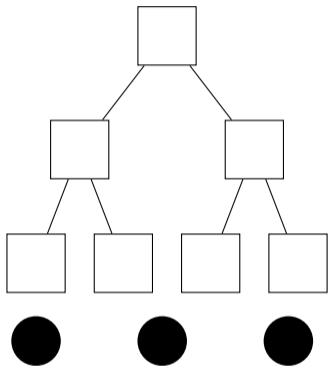
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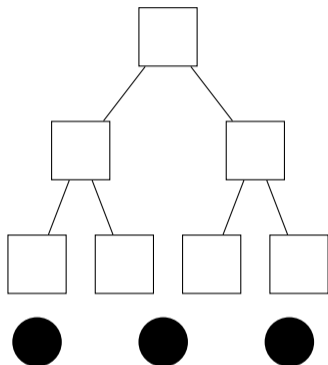


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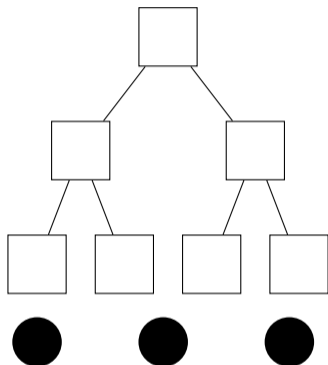


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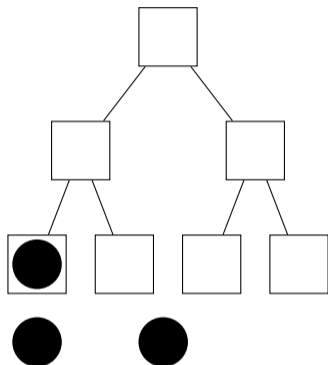
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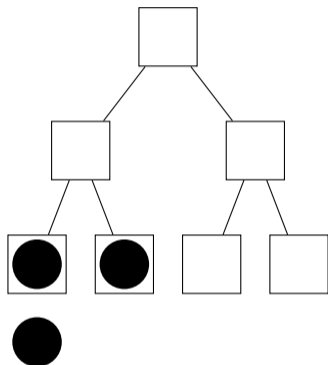
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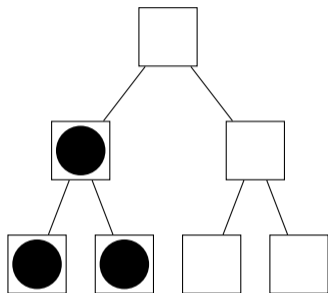
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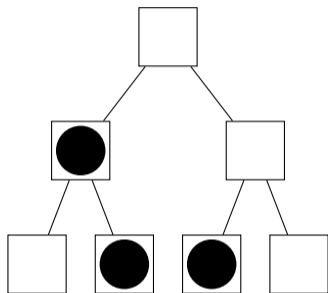
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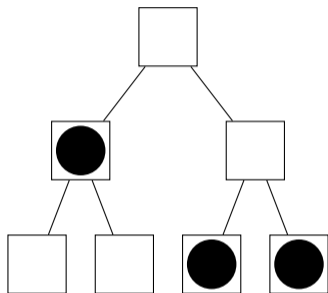
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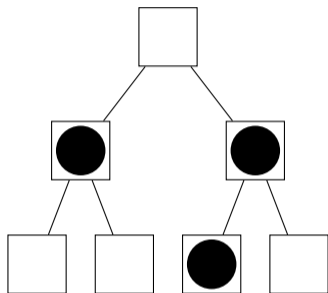
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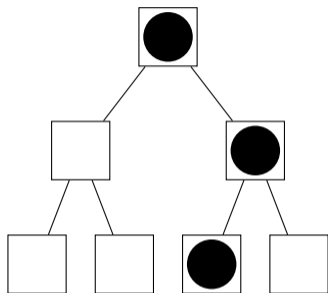
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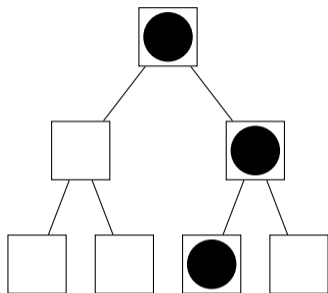
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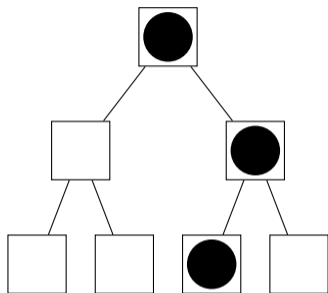
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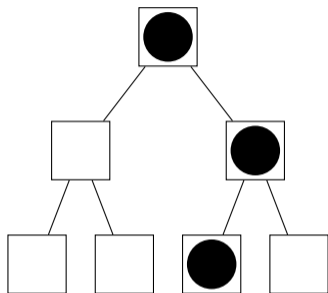
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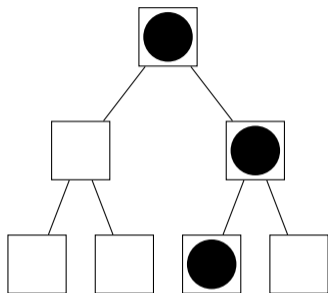
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Conjecture (false): To solve TEP, a branching program needs $\Omega(k^h)$ states.

Conjecture ($\text{TEP} \notin \text{L}$)

TEP can't be solved by a uniform family of branching programs with $2^{O(h)} k^{O(1)}$ states.

Algorithm (pebbling)

The *pebbling algorithm* uses $\Theta((k+1)^h)$ states.

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Algorithm (new)

Our new algorithm uses $(O(\frac{k}{h}))^{2h+\epsilon} k^{\Theta(1)}$ states.

New algorithm defeats $\Omega(k^h)$ conjecture when $h \geq k^{1/2+\epsilon'}$, but is still not log space.

The Tree Evaluation Problem

Motivation and definition

Branching programs and pebbling games

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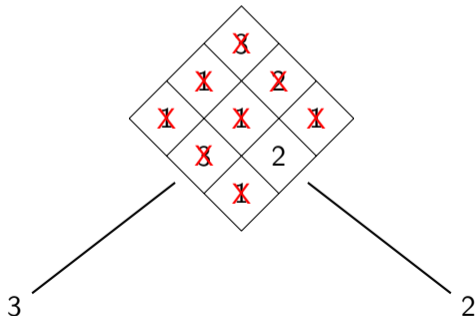
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- ▶ the algorithm is *read-once*
- ▶ or the algorithm is *thrifty*: never reads an irrelevant piece of the input.



The Tree Evaluation Problem

New algorithm

Reversible computation

Solving TEP

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Computing with a full memory: catalytic space [BCKLS 2014].

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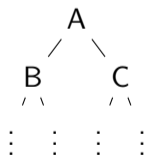
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This rules out the following lower bound argument:

- ▶ At some point, you need to compute B.
- ▶ You need to remember B ($\log k$ bits) while computing C.
- ▶ So, every level of the tree adds $\log k$ bits you need to remember.

Bounded-width polynomial-size branching programs recognize exactly those languages in NC^1 . [D. Barrington 1989]

Computing algebraic formulas using a constant number of registers. [M. Ben-Or, R. Cleve 1992]

Ring R

Inputs $x_1, \dots, x_n \in R$

Work registers $r_1, \dots, r_m \in R$

Reversible instructions:

- ▶ Example: $r_5 \leftarrow r_5 + r_4 \times x_1$.
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Definition

A sequence of reversible instructions *cleanly computes* f into r_i if, once it finishes:

- ▶ $r_i = \tau_i + f(x_1, \dots, x_n)$
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ℓ instructions \Rightarrow branching program with $(\ell + 1)|R|^m$ states.

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	r_1	r_2	r_3
P_1	$\tau_1 + f_1$	τ_2	τ_3
$r_3 \leftarrow r_3 - r_1 \times r_2$	$\tau_1 + f_1$	τ_2	$\tau_3 - \tau_1 \times \tau_2 - f_1 \times \tau_2$
P_2			
$r_3 \leftarrow r_3 + r_1 \times r_2$			
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Lemma: Multiplication

Suppose P_1 cleanly computes f_1 into r_1 and P_2 cleanly computes f_2 into r_2 . Then we can cleanly compute $f_1 \times f_2$ into r_3 as follows:

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$r_3 \leftarrow r_3 + r_1 \times r_2$	$\tau_1 + f_1$	$\tau_2 + f_2$	$\tau_3 + \tau_1 \times f_2 + f_1 \times f_2$
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Cost: need to run P_1 and P_2 twice each. But: no memory needs to be reserved.

The Tree Evaluation Problem

New algorithm

Reversible computation

Solving TEP

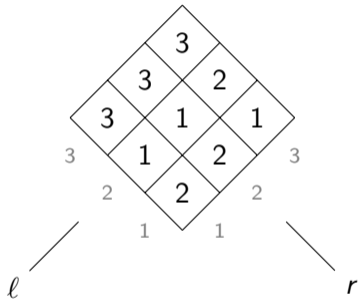
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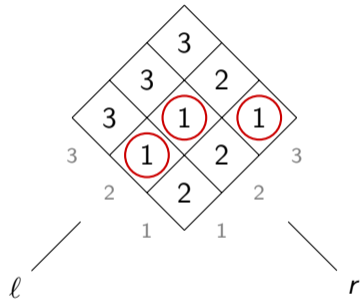


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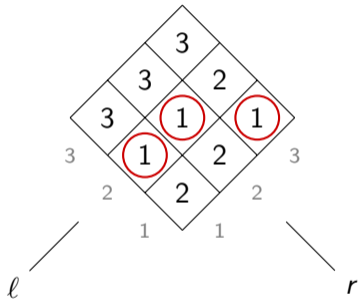


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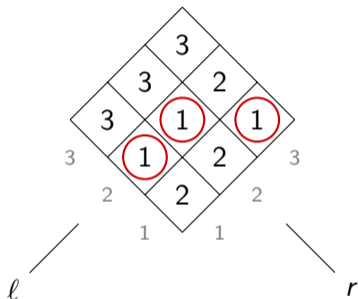
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$$[v = 1] = [l = 2] \times [r = 1] + [l = 2] \times [r = 2] + [l = 1] \times [r = 3]$$

Let f_v denote v 's table. In general,

$$[v = x] = \sum_{(y,z) \in [k]^2} [f_v(y,z) = x] \times [l = y] \times [r = z]$$

First attempt

$$[v = x] = \sum_{(y,z) \in [k]^2} [f_v(y, z) = x] \times [\ell = y] \times [r = z]$$

Algorithm CheckNode(v, x, i)

Parameters: node v , value $x \in [k]$, target register i

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Worse than pebbling, which uses $\Theta((k+1)^h)$ states.

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$r_i \leftarrow r_i - r_j \times r_{j'}$	$r_i \leftarrow r_i - r_j \times r_{j'}$	$r_i \leftarrow r_i - r_j \times r_{j'}$	
$r_{j'} \leftarrow r_{j'} + [r = 1]$	$r_{j'} \leftarrow r_{j'} + [r = 2]$	$r_{j'} \leftarrow r_{j'} + [r = 3]$...
$r_i \leftarrow r_i + r_j \times r_{j'}$	$r_i \leftarrow r_i + r_j \times r_{j'}$	$r_i \leftarrow r_i + r_j \times r_{j'}$...
$r_j \leftarrow r_j - [\ell = 1]$	$r_j \leftarrow r_j - [\ell = 1]$	$r_j \leftarrow r_j - [\ell = 1]$...
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$r_i \leftarrow r_i + r_j \times r_{j'}$	$r_i \leftarrow r_i + r_j \times r_{j'}$	$r_i \leftarrow r_i + r_j \times r_{j'}$	

Running in parallel reduces to 4 recursive calls instead of $4k^2$. The catch: need $3k$ registers instead of 3.

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- ▶ “Hybrid encoding algorithm” interpolates between the two, and uses $(O(\frac{k}{h}))^{2h+\epsilon} k^{\Theta(1)}$ states.
 - ▶ Beats pebbling when $h \geq k^{1/2+\epsilon'}$.

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- ▶ We present a new algorithm for TEP: first improvement over classic “pebbling” algorithm since the problem was introduced in 2010.
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Future work

- ▶ Improve the algorithm. (Better ways to compute d -ary products? We’re not the first to want them.)
- ▶ Find new TEP lower bounds that apply to these algorithms. (Old lower bounds apply only to read-once or “thrifty” algorithms.)

Thanks!