

# Exact computation of the number of accepting paths of an NTM

Subrahmanyam Kalyanasundaram<sup>1</sup>    Kenneth W. Regan<sup>2</sup>

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February 16, 2018  
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# Outline

- 1 Problem Statement & Background
- 2 BFS Approach
- 3 Block Trace Approach
- 4 Main Theorem
- 5 Conclusion

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# Trying to Understand Nondeterminism

- ▶ One of the fundamental goals is to understand the power of nondeterminism.
- ▶ Is nondeterministic computation really more powerful than deterministic computation?
- ▶ A concrete answer would resolve the P vs. NP question.
- ▶ In this paper, we study how fast we can count the number of accepting paths of an NTM.

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- ▶ In this paper, we study how fast we can count the number of accepting paths of an NTM.

# The question

## Question

*If an NTM  $N$  runs in time  $t = t(n)$ , how fast can we deterministically count the number of accepting computations?*

- ▶ We can count using the configuration graph.
- ▶ For a graph of size  $S$ , this results in an  $O(S)$  algorithm.
- ▶ Typically  $S \sim a^{kt}$ .

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# Main Result

## Theorem

*Given an NTM  $N$ , which runs in time  $t$ , we can count the number of accepting paths of  $N$  on a given input in time*

$$a^{kt/2} H_a^{k\sqrt{t}\log t} q^2 \text{poly}(\log q, k, t, a).$$

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## Related Results: What is known already

- ▶ Counting variants of different problems behave differently.
  - ▶ Polynomial time: Kirchhoff's matrix-tree theorem and Kasteleyn's theorem.
  - ▶ #P-complete: Perfect matchings in an arbitrary graph and satisfying assignments of a CNF formula.
  - ▶ FPRAS: Satisfying assignments of a DNF formula and perfect matchings in a bipartite graph.
- ▶ But no result for general nondeterministic machines.
- ▶ [vMS 05]: Faster simulation of probabilistic polytime machines in time  $o(2^t)$ .
  - ▶ Model of [vMS 05] restrict the amount of nondeterministic choices.

# Our approach

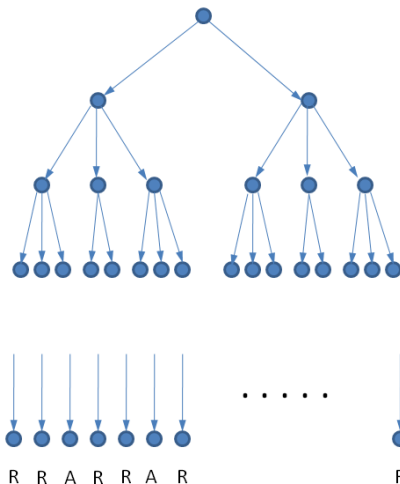
- ▶ [KLRS 2011] showed that NTM simulation can be performed in  $a^{kt/2}$  time.
- ▶ Combined two approaches: BFS and Block Trace.
- ▶ We extend the above to the problem of counting the number of accepting paths.

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# Configuration Tree



# The Naive Approach

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- ▶ This approach takes  $c^t$  time, where  $c$  is the maximum degree of the computation tree.

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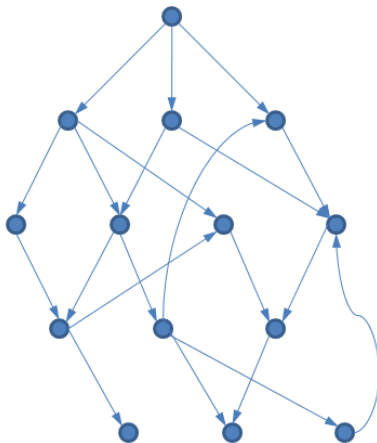
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# BFS on Configuration Graph



# BFS on Configuration Graph

- ▶ BFS can be used to count the number of shortest paths.
  - ▶ But each accepting path need not be a shortest path.
- ▶ We modify the configuration graph as follows:
  - ▶ In place of each configuration  $\rho$ , we have  $(\rho, i)$ .
  - ▶ For a directed edge  $\rho \rightarrow \rho'$ , we have  $(\rho, i) \rightarrow (\rho', i + 1)$ .
  - ▶ All paths are shortest paths.
- ▶ Total no. of vertices is  $S \cdot (t + 1) = a^{kt} t^k q \cdot (t + 1)$ .

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  - ▶ For each vertex  $(\rho, i)$ , we compute the number of (shortest) paths from  $(\rho_x, 0)$ .
  - ▶ Then sum up the number of accepting computation paths.

## Theorem

*This approach takes  $a^{kt} q^2 (3at)^k \text{poly}(\log q, k, t, a)$  time.*

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# Block Traces

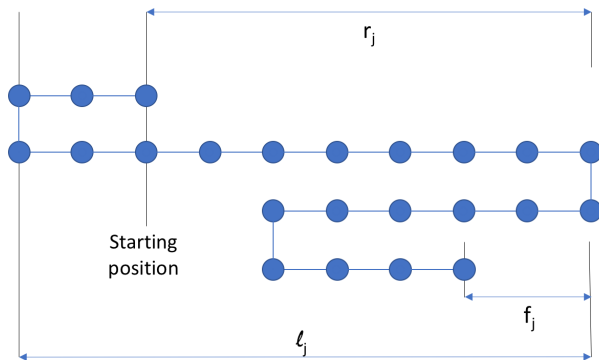
- ▶ A segment of block size  $d$  consists of the following over the next  $d$  steps:
  - ▶ How far to the right do the tape heads go?
  - ▶ How far to the left do the tape heads go?
  - ▶ Where do the tape heads end up?
  - ▶ What are contents of the cells traversed?
- ▶ A block trace is a sequence of such segments.
- ▶ Each computation path correspond to a distinct block trace witness.

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# Block Trace Approach

## Lemma

*The number of accepting computations on a given input that are compatible with a given block trace witness can be calculated in time  $q^2 a^{3kd} \text{poly}(\log q, k, t, a, d)$ .*

- ▶ We try all possible block traces and compute the number of accepting paths.
- ▶ Number of block traces =  $a^{kt} 32^{kt/d}$ .
- ▶ Optimizing for the block size  $d$ , we get the following:

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*The number of accepting computation paths on a given input can be computed in time*

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*where  $C_a$  is a constant that depends only on  $a$ .*

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# Idea: Combine the approaches

- ▶ Two approaches: BFS and Block Traces.
- ▶ Both have comparable running time with  $a^{kt}$  being the dominant factor.
- ▶ The idea is to mix the two cleverly.

# Tape Usage is Less than Half

- ▶ In the BFS approach,  $a^{kt}$  factor was due to number of tape configurations.
- ▶ Maximum possible tape usage is  $kt$ .
- ▶ If the tape usage is less, then we could save time on the BFS approach.

## First Observation

If the total tape use is  $\leq kt/2$ , then the BFS approach runs in time roughly  $a^{kt/2}$ .

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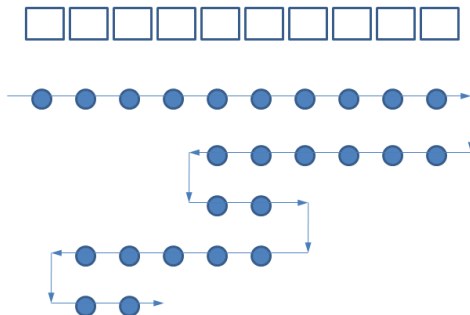
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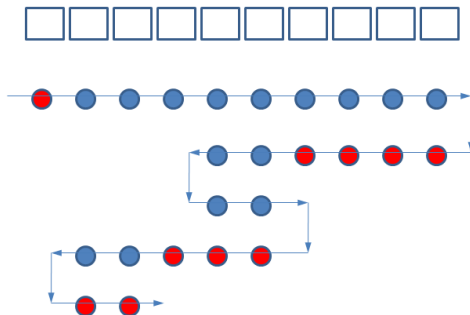
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# Tape Usage is More than Half

- ▶ For every location visited, there is a last visit.
- ▶ If the total tape use is  $\geq kt/2$ , over half the visits are last visits.
- ▶ There is no need to write anything during the last visit.
- ▶ This saves a factor of  $a^{kt/2}$  in the block trace approach.

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# The Whole Algorithm

- ▶ List down all possible directional paths.
- ▶ Compare the total tape usage to  $kt/2$ .
- ▶ Depending on the comparison, choose the approach.

## Theorem (Main Theorem)

*The number of accepting computations of an NTM on a given input can be computed in time*

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  - ▶ Parity classes  $\oplus P$  and  $\text{Mod}_k P$ .
  - ▶ Probabilistic classes  $PP$ ,  $BPP$ ,  $ZPP$  and  $BQP$  (an improvement over [vMS 05]).
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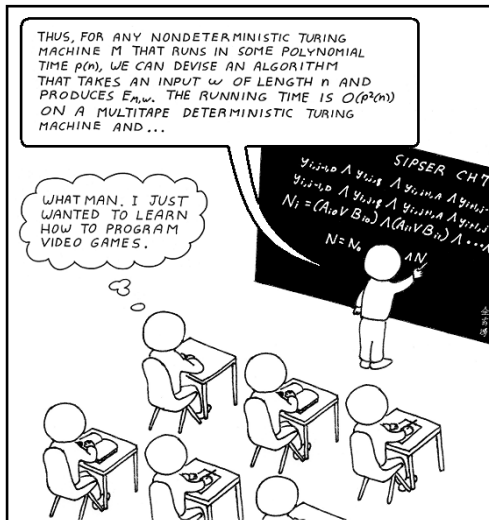
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# Thank You



"Rite of Passage": Abstruse Goose Comic, available at <http://abstrusegoose.com/206> with minor changes.

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