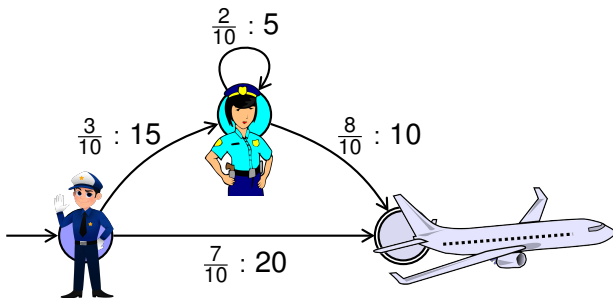


# Counting Problems for Parikh Images

Christoph Haase   *Stefan Kiefer*   Markus Lohrey

MFCS 2017, Aalborg  
25 August 2017

# The Cost Problem



What is the probability to reach the gate in 25–45min?  
Quantiles?

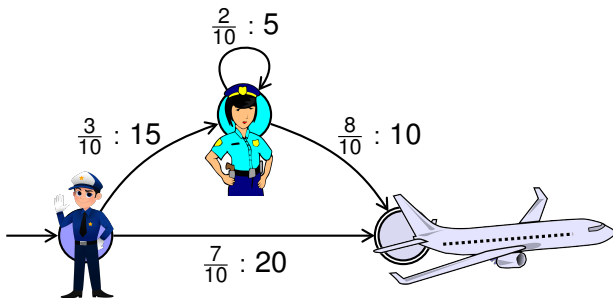
Cost Problem :=

Input: Cost Markov chain  
cost formula  $\varphi$

$25 \leq \text{cost} \leq 45$

Output:  $\Pr(\varphi)$

# The Cost Problem



What is the probability to reach the gate in 25–45min?  
Quantiles?

Cost Problem :=

Input: Cost Markov chain  
cost formula  $\varphi$   
threshold  $\tau \in [0, 1]$

Output: Is  $\Pr(\varphi) \geq \tau$  ?

$25 \leq \text{cost} \leq 45$

# Complexity of the Cost Problem

Theorem (Laroussinie, Sproston, FoSSaCS'05)

*The cost problem is in EXPTIME.*

*The cost problem is NP-hard.*

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by reduction from the  
**Kth largest subset problem**

COMPUTERS AND INTRACTABILITY  
A Guide to the Theory of NP-Completeness

Michael R. Garey / David S. Johnson

[SP20] **K<sup>th</sup> LARGEST SUBSET (\*)**

INSTANCE: Finite set  $A$ , size  $s(a) \in \mathbb{Z}^+$  for each  $a \in A$ , positive integers  $K$  and  $B$ .

QUESTION: Are there  $K$  or more distinct subsets  $A' \subseteq A$  for which the sum of the sizes of the elements in  $A'$  does not exceed  $B$ ?

Reference: [Johnson and Kashdan, 1976]. Transformation from SUBSET SUM.

Comment: **Not known to be in NP.** Solvable in pseudo-polynomial time (polyno-

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**Kth largest subset problem**

Theorem (HK, IPL'16)

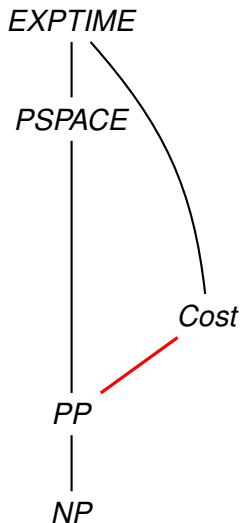
*The Kth largest subset problem is **PP-complete**.*

a superset of NP

Corollary

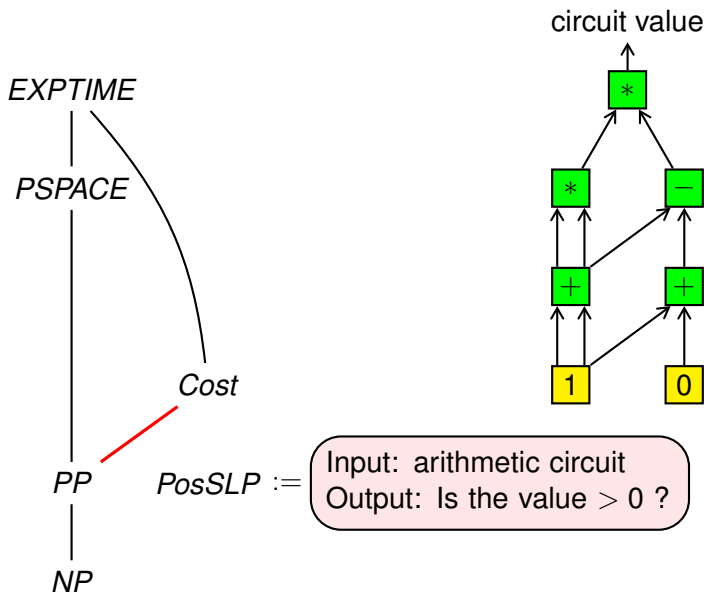
*The cost problem is PP-hard.*

# Complexity of the Cost Problem

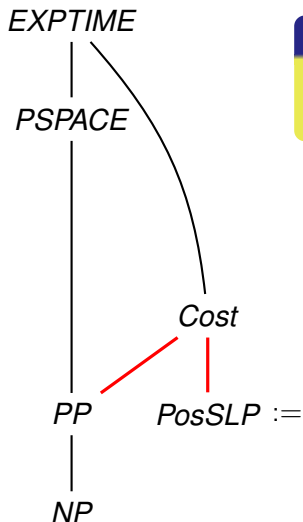




# Complexity of the Cost Problem



# Complexity of the Cost Problem



Theorem (HK, ICALP'15)

*The cost problem is PosSLP-hard.*

*PosSLP* :=

Input: arithmetic circuit  
Output: Is the value  $> 0$  ?

# Complexity of the Cost Problem

*EXPTIME*

*PSPACE*

*Cost*

*PP*

*PosSLP* :=

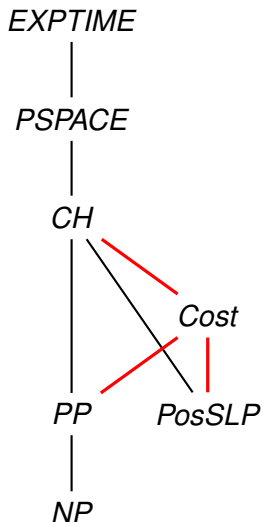
*NP*

Theorem (HK, ICALP'15)

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The cost problem is in PSPACE.*

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# Complexity of the Cost Problem



Theorem (HK, ICALP'15)

*The cost problem is PosSLP-hard.  
The cost problem is in PSPACE.*

Theorem (HKL, LICS'17)

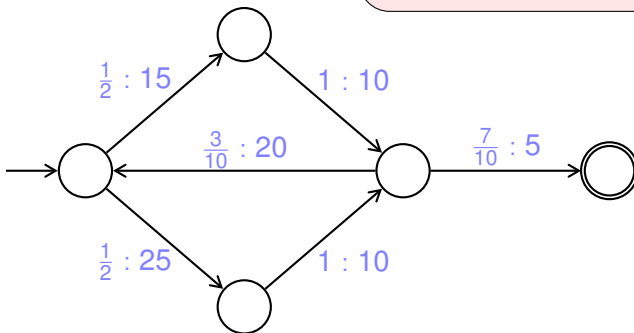
*The cost problem is in CH.*

# Solving the Cost Problem

Cost Problem :=

Input: Cost Markov chain  
cost formula  $\varphi$

Output:  $\Pr(\varphi)$

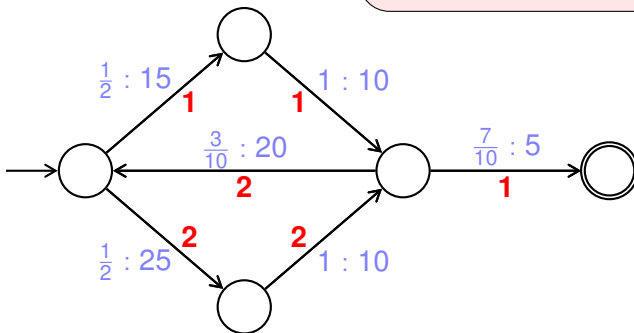


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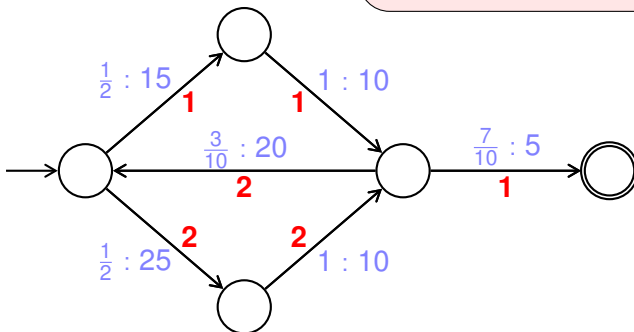


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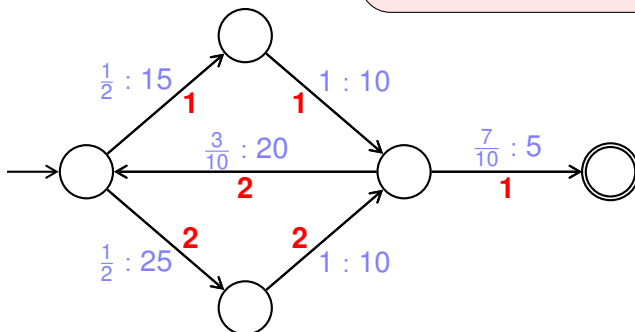
Enumerate the **Parikh images**.

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Enumerate the **Parikh images**.

Problem: there might be **multiple** paths per Parikh image.

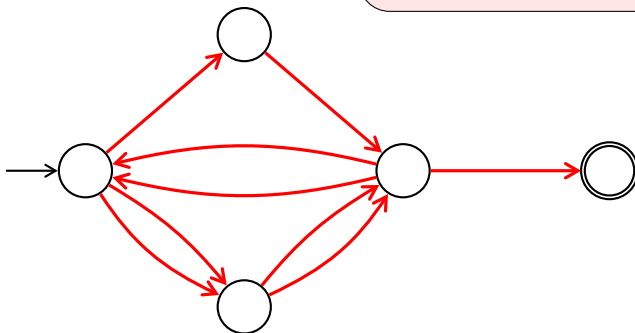


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Enumerate the **Parikh images**.

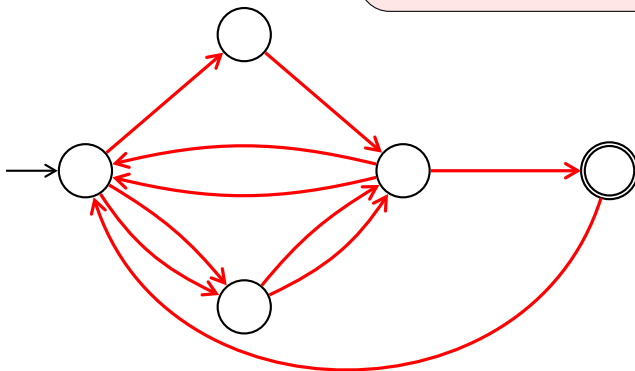
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# Solving the Cost Problem

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Input: Cost Markov chain  
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Output:  $\Pr(\varphi)$



Enumerate the **Parikh images**.

Problem: there might be **multiple** paths per Parikh image.

# The BEST Theorem

Theorem (de Bruijn, van Aardenne-Ehrenfest, Smith, Tutte)

The *number of Eulerian cycles* in an Eulerian graph  $G$  equals

$$t(G) \cdot \prod_{v \in V} (d(v) - 1)!$$

number of directed  
spanning trees in  $G$

Theorem (Tutte's matrix-tree theorem)

$$t(G) = \det(L(G)_{11})$$

Laplacian of  $G$

# QUANT: A Tool for the Cost Problem

Theorem ([HK, ICALP'15], [HK, IPL'16], [HKL, LICS'17])

*The cost problem is hard for PP and PosSLP.*

*The cost problem is in CH.*

```
while solver.check() == sat:
    model = solver.model()

    for t in T:
        v = model[tv[t]].as_long()
        M.itemset((t[0], t[1]), v)

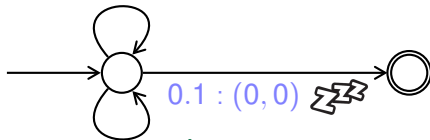
    minor = Decimal(round(np.linalg.det(laplacian(M)[1:,1:])))
    degs = Decimal(np.prod(map(math.factorial, degreeVector(M) -
                               np.ones(m+1))))
    weights = Decimal(np.prod(map(math.factorial, [ model[tv[t]].as_long()
                                                    for t in T ])))
    probs = Decimal(np.prod([math.pow(P[t],
                                       model[tv[t]].as_long()) for t in T]))
    p += ((minor * degs) / weights) * probs


    if p > threshold:
        return p

    solver.add(Or([tv[t] != model[tv[t]] for t in T]))
return p
```

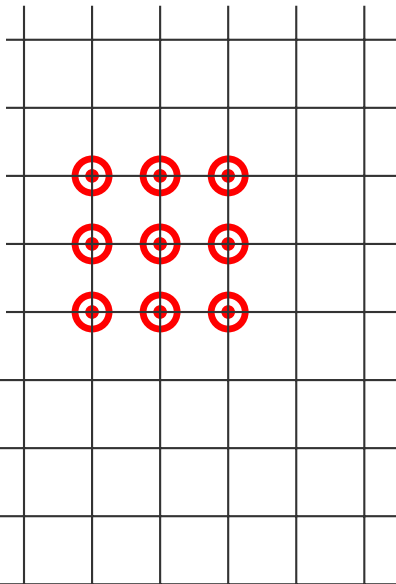
# QUANT: A Tool for the Cost Problem

0.45 : (1, 0) 



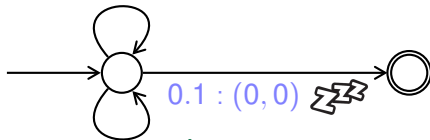
0.45 : (0, 1) 


What is  $\Pr(\text{cost} \in [4, 6]^2)$ ?



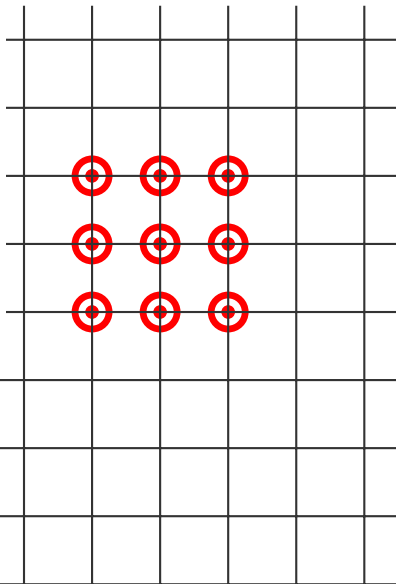
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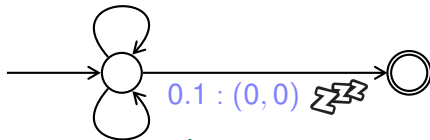
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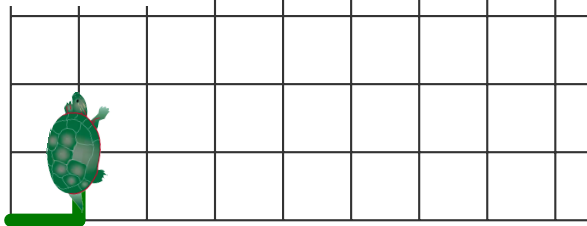
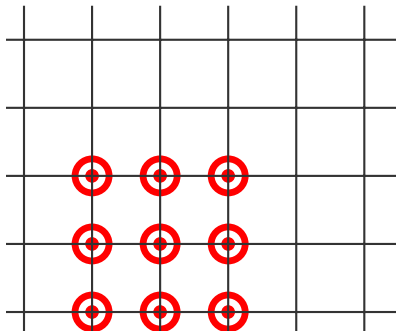
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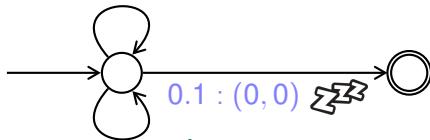
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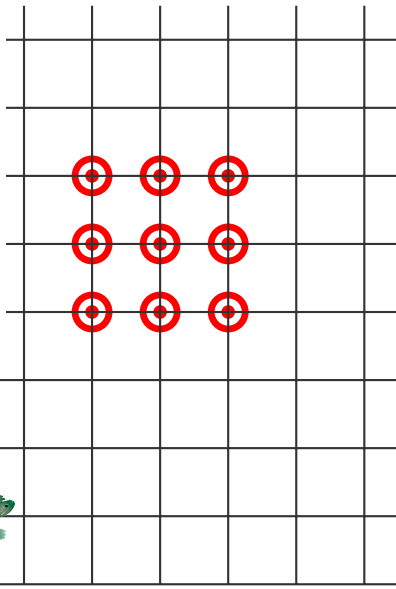
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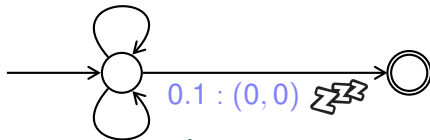
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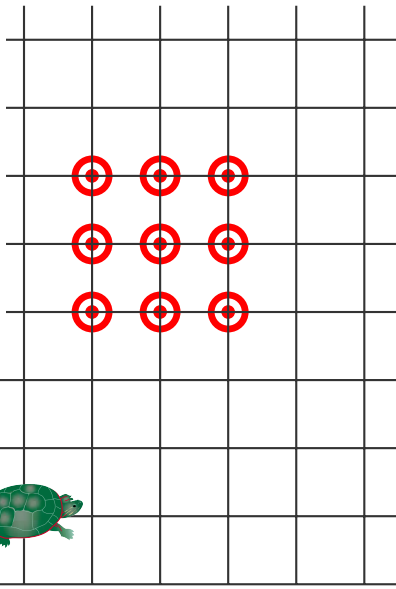
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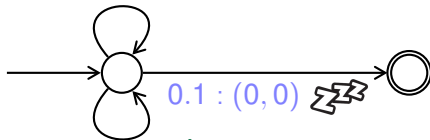
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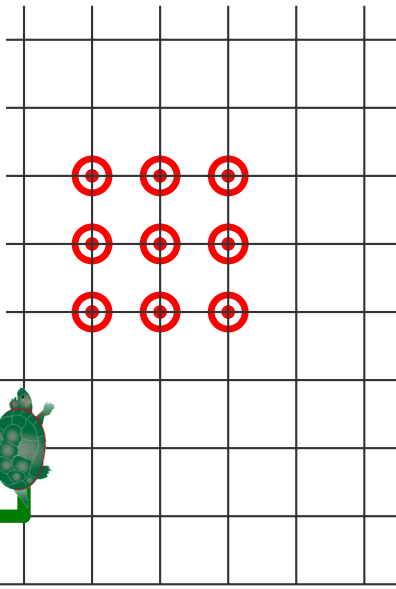
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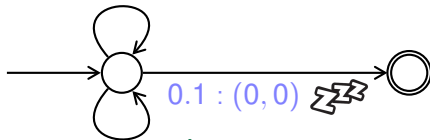
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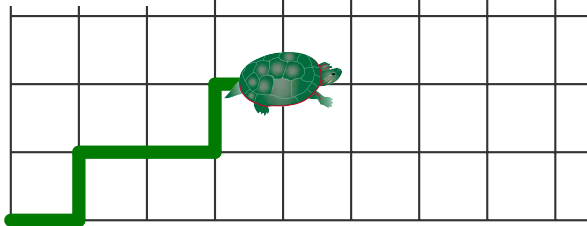
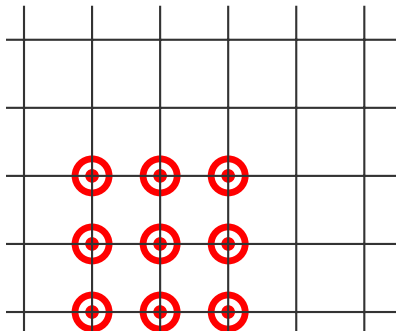
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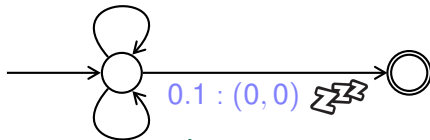
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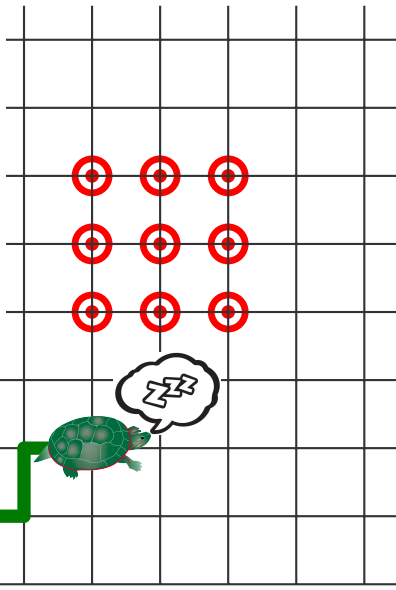
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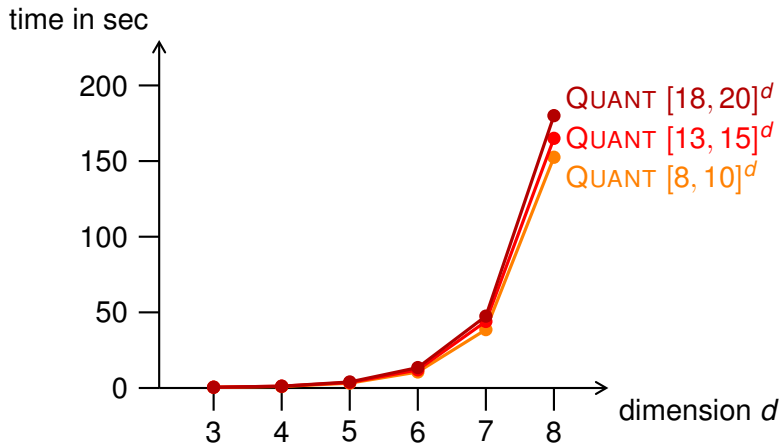


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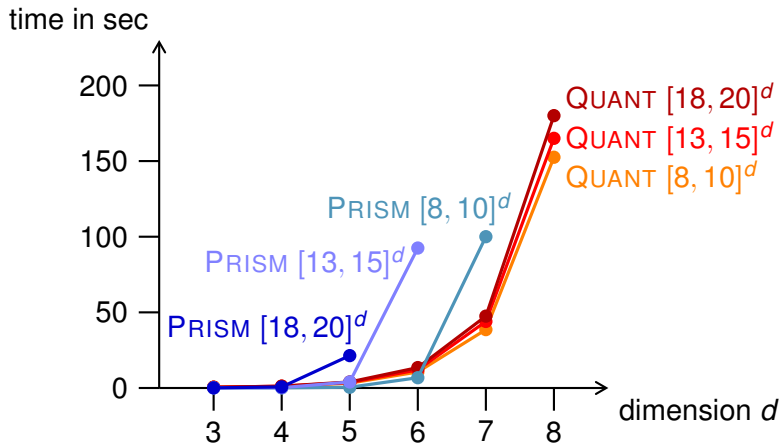
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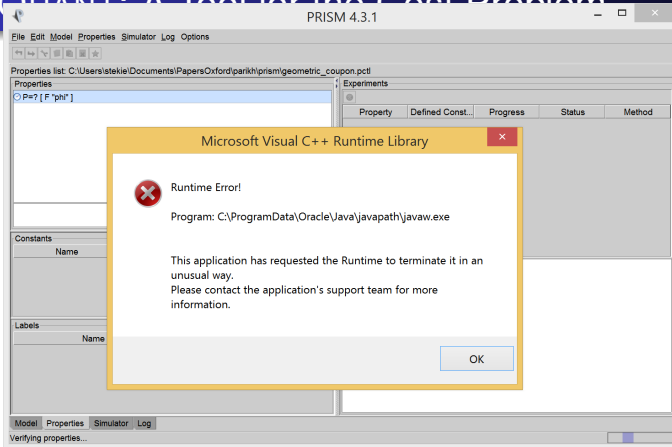


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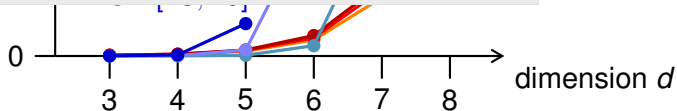


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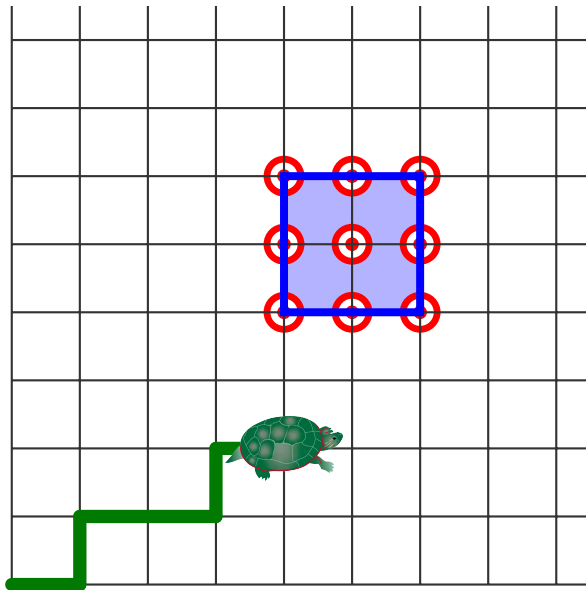




$\tau [18, 20]^d$   
 $\tau [13, 15]^d$   
 $\tau [8, 10]^d$

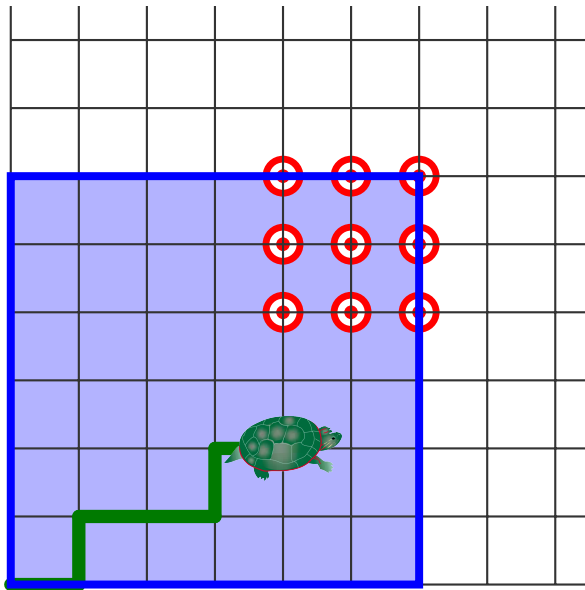


# QUANT: A Tool for the Cost Problem





# QUANT: A Tool for the Cost Problem



# Counting Parikh Images

$\Sigma$ : finite alphabet

$\mathbf{p} \in \mathbb{N}^{\Sigma}$ : vector

$\mathcal{A}$ : language generator (DFA, NFA, CFG)

$N(\mathcal{A}, \mathbf{p})$ : number of words accepted by  $\mathcal{A}$  with Parikh image  $\mathbf{p}$

Example: for  $\mathcal{A} = a^*ba^*$  and  $\mathbf{p} = (2, 1)$ :  $N(\mathcal{A}, \mathbf{p}) = 3$

PosParikh :=

Input: Language generators  $\mathcal{A}, \mathcal{B}$   
vector  $\mathbf{p} \in \mathbb{N}^{\Sigma}$

Output: Is  $N(\mathcal{A}, \mathbf{p}) > N(\mathcal{B}, \mathbf{p})$  ?

Different variants:

- language generator: DFA, NFA, CFG
- unary or binary encoding of  $\mathbf{p}$
- fixed or variable alphabet  $\Sigma$

# Results of This Paper: Complexity of PosParikh

vector $\mathbf{p}$	size of $\Sigma$	DFA	NFA	CFG
unary encoding	unary	in L	NL-c.	P-c.
	fixed	PL-c.	PP-c.	
	variable			
binary encoding	unary	in L	NL-c.	DP-c.
	fixed	PosMatPow-hard, in CH	PSPACE-c.	PEXP-c.
	variable	PosSLP-hard, in CH		

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	variable	PosSLP-hard, in CH		

BitParikh :=

Input: Language generator  $\mathcal{A}$

vector  $\mathbf{p} \in \mathbb{N}^{\Sigma}$

number  $i \in \mathbb{N}$  in binary

Output: Is the  $i$ -th bit of  $N(\mathcal{A}, \mathbf{p})$  equal to 1 ?

PosMatPow :=

Input:  $m \times m$  integer matrix  $M$  (in binary)  
number  $n \in \mathbb{N}$  (in binary)  
Output: Is  $(M^n)_{1,m} \geq 0$  ?

The entries of  $M^n$  are of exponential size.

Theorem (Galby, Ouaknine, Worrell, 2015)

*PosMatPow is in P for  $m = 2$ .*

*PosMatPow is in P for  $m = 3$  and  $M$  given in unary.*

PosMatPow reduces to PosSLP.

Theorem (HKL, 2017)

*PosMatPow reduces to*

*PosParikh with DFAs, binary encoding of  $\mathbf{p}$ , even for  $|\Sigma| = 2$ .*

# From Matrix Powers to Graphs

$G$ : multi-graph with edges labelled by multiplicities

$N(G, u, v, n)$  : number of paths from  $u$  to  $v$  of length  $n$

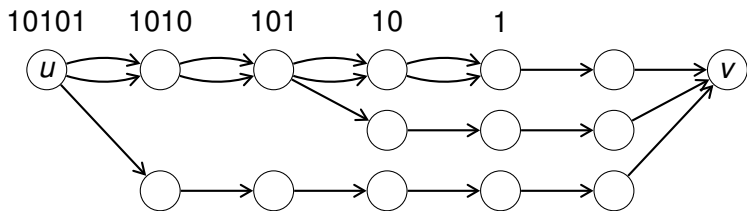
## Lemma

*Given an integer matrix  $M$  and indices  $i, j$ , one can compute in logspace a multi-graph  $G$  with vertices  $u, v^+, v^-$  such that*

$$(M^n)_{i,j} = N(G, u, v^+, n) - N(G, u, v^-, n) \quad \text{for all } n \in \mathbb{N}.$$

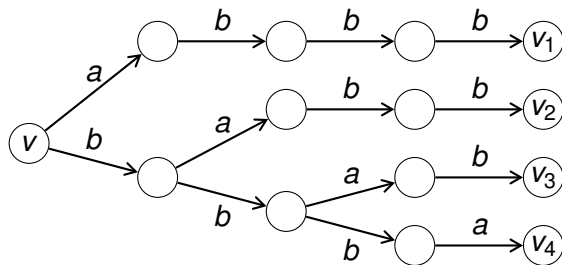
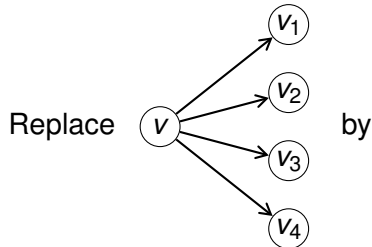
# Getting Rid of Edge Weights

Replace  $u \xrightarrow{21} v$  by



The edge weights are removed at the expense of longer paths.

# From Graphs to DFAs





Counting Parikh images is closely related to performance analysis of probabilistic systems.

The complexity depends strongly on various parameters:

- language generator: DFA, NFA, CFG
- unary or binary encoding of  $p$
- fixed or variable alphabet  $\Sigma$

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