#### Quantum Lattice Enumeration in Limited Depth CRYPTO 2024

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### Why Lattice Enumeration?

- Lattice-based constructions popular
- ▶ 3 out of 4 NIST *post-quantum standards* are based on lattice assumptions



### Why Lattice Enumeration as SVP Solver?

- Leading cost of state-of-the-art attacks is cost of SVP solver
- Lattice sieving analyzed in quantum setting<sup>1</sup>
- Quantum lattice enumeration analyzed in *asymptotic* setting<sup>2</sup> and unbounded quantum circuit model<sup>3</sup>

<sup>&</sup>lt;sup>1</sup>[1] Albrecht et al. "Estimating Quantum Speedups for Lattice Sieves"

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Concrete speedup of quantum lattice enumeration for practical parameters remains unclear.

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Today



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► GCost: Number of quantum gates



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▶ Hypothetical  $MaxDepth \in \{2^{40}, 2^{64}, 2^{96}\}$  by NIST<sup>4</sup>:

<sup>&</sup>lt;sup>4</sup>[9] NIST Submission Requirements and Evaluation Criteria for the Post-Quantum Cryptography Standardization Process



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One needs: T-DEPTH(QENUM)  $\leq$  MAXDEPTH

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#### Setup

- Lattice  $\mathcal{L}(B)$ , dimension *n*
- Enumeration: Given *B*, bound *R*, finds  $\vec{v}$  s.t.  $0 < ||\vec{v}|| \le R$

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► DFS defines enumeration tree(s)



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#### Time complexity

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# Quantum Lattice Enumeration

#### Time complexity

- ► Classical:  $\mathcal{O}(\#\mathcal{T}(r))$
- ► Quantum<sup>6</sup>:
  - QPE:  $\mathcal{O}(\sqrt{\#\mathcal{T}(r)\cdot n})$  calls to  $\mathcal{W}$
  - poly(n) classical repetitions of QPE(W)



<sup>&</sup>lt;sup>6</sup>[8] Montanaro's "Quantum-Walk Speedup of Backtracking Algorithms"

# Quantum Lattice Enumeration

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- ► Quantum<sup>6</sup>:
  - QPE:  $\mathcal{O}(\sqrt{\#\mathcal{T}(r)\cdot n})$  calls to  $\mathcal{W}$
  - poly(n) classical repetitions of QPE(W)

Only  $QPE(\mathcal{W})$  is a quantum circuit:

 $\text{T-Depth}(\text{QEnum}(\mathcal{T}(r))) = \text{T-Depth}(\text{QPE}(\mathcal{W}))$ 





<sup>&</sup>lt;sup>6</sup>[8] Montanaro's "Quantum-Walk Speedup of Backtracking Algorithms"

### Depth of Full Quantum Enumeration

Disclaimer: Very loosely estimated numbers. (don't quote us on **these**)

- QPE(W) applied to full enumeration tree of depth  $\beta$
- ▶ Ignoring Jensen's Gap  $\mathbb{E}[\sqrt{\#\mathcal{T}(r) \cdot h}]$  (we will come back to this later)
- Limitation:  $log_2(MAXDEPTH) \in \{40, 64, 96\}$

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$$\log_2 \mathbb{E}[\text{T-Depth}(\text{QPE}(\mathcal{W}))] \approx \begin{cases} 90 & \text{for Kyber-512} \leq \log(\text{MaxDepth}) \\ 166 & \text{for Kyber-768} \gg \log(\text{MaxDepth}) \\ 263 & \text{for Kyber-1024} \gg \log(\text{MaxDepth}) \end{cases}$$

Today



# A Quantum-Classical Algorithm (simplified)

• Classical precomputation: up to level k



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# A Quantum-Classical Algorithm (simplified)

- Classical precomputation: up to level k
   QENUM( $\mathcal{T}(g_i)$ ) for every node  $g_i$  on level k
   Choose level k such that T-DEPTH(QPE(W))  $\leq$  MAXDEPTH
  - ... and also reducing overall cost.





(1) Size  $\# \mathcal{T}(g_i)$  of subtrees<sup>7</sup>



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- (1) Size  $\# \mathcal{T}(g_i)$  of subtrees<sup>7</sup>
- (2) Distribution of subtrees<sup>7</sup>
- (3) #calls to  $\mathcal{W}^7$ :  $\sqrt{\#\mathcal{T}(g_i) \cdot h}$
- (4) Multiplicative Jensen's Gap 2<sup>z</sup>: (property of the trees)





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Today



Compute

 $\textbf{Total Cost} = \textbf{Classical Precomputation} + \underset{\substack{\text{random}\\\text{tree }\mathcal{T}}}{\mathbb{E}} \left[ \sum_{\substack{g_i\\\text{on level }k}} \textbf{GCOST}(\textbf{QENUM}(\mathcal{T}(g_i))) \right]$ 

Compute

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-

with level k such that

T-Depth(QPE(W))  $\leq$  MaxDepth,

-

Compute

$$\textbf{Total Cost} = \textbf{Classical Precomputation} + \underset{\substack{\text{random}\\\text{tree } \mathcal{T}}}{\mathbb{E}} \left[ \sum_{\substack{g_i\\\text{on level } k}} \textbf{GCOST}(\textbf{QENUM}(\mathcal{T}(g_i))) \right]$$

-

with level k such that

 $\text{T-Depth}(\mathsf{QPE}(\mathcal{W})) \leq \text{MaxDepth},$ 

compare **Total Cost** to running Grover's algorithm on  $AES^8$ .

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 $<sup>^{8}\</sup>ensuremath{[7]}$  Jaques et al. "Implementing Grover Oracles for Quantum Key Search on AES and LowMC"

Compute

$$\textbf{Total Cost} = \textbf{Classical Precomputation} + \mathbb{E}_{\substack{\text{random} \\ \text{tree } \mathcal{T}}} \left[ \sum_{\substack{g_i \\ \text{on level } k}} \textbf{GCOST}(\textbf{QENUM}(\mathcal{T}(g_i))) \right]$$

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with level k such that

 $\text{T-Depth}(\mathsf{QPE}(\mathcal{W})) \leq \text{MaxDepth},$ 

compare **Total Cost** to running Grover's algorithm on AES<sup>8</sup>.

Find Jensen's Gap  $2^z$  such that

**Total Cost**  $\leq$  Cost of Grover on AES with T-DEPTH(QPE(W))  $\leq$ MAXDEPTH

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Reminder: Multiplicative Jensen's Gap $2^z \cdot \mathbb{E}[\sqrt{X}] \leq \sqrt{\mathbb{E}[X]}$ 

more likely to be feasible							less li	kely to be feasible
	Kyber-512		Kyber-768			Ky	ber-1024	
			W					
MaxDepth	1	minimal		1	minimal		1	minimal

Reminder: Multiplicative Jensen's Gap $2^z \cdot \mathbb{E}[\sqrt{X}] \leq \sqrt{\mathbb{E}[X]}$ 

more likely to be feasible						less lil	kely to be feasible	
	Kyl	per-512		Kyber-768		Kyl	ber-1024	
		$\operatorname{GCOST}$ of quantum walk operator ${\mathcal W}$						
MaxDepth	1	minimal	1	l minin	nal	1	minimal	

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more likely to be feasible							less like	ly to be feasible
	Kybe	er-512		Kybe	r-768		Kybe	r-1024
		$\operatorname{GCOST}$ of quantum walk operator ${\mathcal W}$						
MaxDepth	1	minimal		1	minimal		1	minimal
2 <sup>40</sup>	$z \ge 0$	$z \ge 0$		$z \ge 2$	$z \ge 17$		$z \ge 50$	z > 64
2°4	$z \geq 0$	$z \geq 0$		$z \geq 1$	$z \ge 17$		$z \ge 49$	z > 64
296	$z \geq 0$	$z \geq 0$		$z \geq 1$	$z \ge 19$		$z \ge 51$	z > 64

Reminder: Multiplicative Jensen's Gap  $2^{z} \cdot \mathbb{E}[\sqrt{X}] < \sqrt{\mathbb{E}[X]}$ 

"hypothetical lower bounds" for  $\#\mathcal{T}(g_i)$  (LB/UB in our paper)

more likely to be feasible					less likel	y to be feasible		
	Kybe	er-512	Kybe	r-768	Kybe	r-1024		
		$\operatorname{GCost}$ of quantum walk operator ${\mathcal W}$						
MaxDepth	1	minimal	1	minimal	1	minimal		
2 <sup>40</sup>	$z \geq 0$	$z \ge 0$	$z \geq 2$	$z \ge 17$	$z \ge 50$	z > 64		
2 <sup>64</sup>	$z \ge 0$	$z \ge 0$	$z \geq 1$	$z \ge 17$	$z \ge 49$	z > 64		
2 <sup>96</sup>	$z \ge 0$	$z \ge 0$	$z \ge 1$	$z \ge 19$	$z \ge 51$	z > 64		
		~						

quantum speedup... ...may be possible

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more likely to be feasible					less like	ly to be feasible	
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MaxDepth	1	minimal	1	minimal	1	minimal	
2 <sup>40</sup> 2 <sup>64</sup> 2 <sup>96</sup>	$ \begin{array}{cccc} z &\geq 0 \\ z &\geq 0 \\ z &\geq 0 \end{array} $	$ \begin{array}{cccc} z &\geq 0 \\ z &\geq 0 \\ z &\geq 0 \end{array} $	$z \ge 2$ $z \ge 1$ $z \ge 1$	$z \ge 17$ $z \ge 17$ $z \ge 19$	$ \begin{array}{c c} z \ge 50 \\ \hline z \ge 49 \\ \hline z \ge 51 \end{array} $	z > 64 $z > 64$ $z > 64$	
quantum speedup	may b	e possible	may be "tri quantum	possible for vial" operator			

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"state-of-the-art" bounds for  $\#\mathcal{T}(g_i)$  (UB/UB in our paper)

more likely to be feasible							less like	y to be feasible
	Kybe	r-512		Kybe	r-768		Kybe	r-1024
		$\operatorname{GCost}$ of quantum walk operator ${\mathcal W}$						
MaxDepth	1	minimal		1	minimal		1	minimal
2 <sup>40</sup> 2 <sup>64</sup> 2 <sup>96</sup>	$z \ge 20$ $z \ge 20$ $z \ge 15$	$ \begin{array}{r}z \geq 36 \\ z \geq 36 \\ z \geq 40\end{array} $		$z \ge 61$ $z \ge 61$ $z \ge 61$	z > 64 $z > 64$ $z > 64$		z > 64 $z > 64$ $z > 64$ $z > 64$	

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		$\operatorname{GCost}$ of quantum walk operator ${\mathcal W}$						
MaxDepth	1	minimal	1	minimal		1	minimal	
2 <sup>40</sup> 2 <sup>64</sup> 2 <sup>96</sup>	$ \begin{array}{c} z \ge 20 \\ z \ge 20 \\ z \ge 15 \end{array} $	$z \ge 36$ $z \ge 36$ $z \ge 40$	$ \begin{array}{c c} z \ge 61 \\ z \ge 61 \\ z \ge 61 \end{array} $	z > 64 $z > 64$ $z > 64$		z > 64 $z > 64$ $z > 64$ $z > 64$	z > 64 $z > 64$ $z > 64$	

quantum speedup...

...questionable even for "trivial" quantum operator

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#### Conclusion

There exists a gap between generous lower bounds, and actual expected cost.

 $2^z$ , W, ... (more in our paper)

Better understanding of degree of uncertainty from properties of enumeration trees.

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ePrint:
https://eprint.iacr.org/2023/1423
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Code:

https://github.com/mtiepelt/QuantumLatticeEnumeration

Slides:

(link to eprint)

https://mtiepelt.github.io/Pages/Publications

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