

Concrete Analysis of Quantum Lattice Enumeration

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- Lattices are a popular choice for post-quantum cryptography.
- 2 popular generic attacks:
 - Sieving (faster, but exponential space).
 - **Enumeration** (slower, but polynomial space).
- Most literature is about asymptotics.
- Our work: concrete quantum look.

History of Work

- [Bel13] Belovs's quantum walk
- [AK17, Mon18] Quantum tree backtracking algorithm
- [ADPS16, ABB+ 17, PLP16] Quantum Enumeration is mentioned
- [ANS18] Presenting quantum lattice enumeration and its variations are discussed at a high level without going into detail about quantum circuits and resource estimates

Our work

Proposed a concrete implementation of Montanaro's algorithm for lattice enumeration, and its circuit resource estimates.

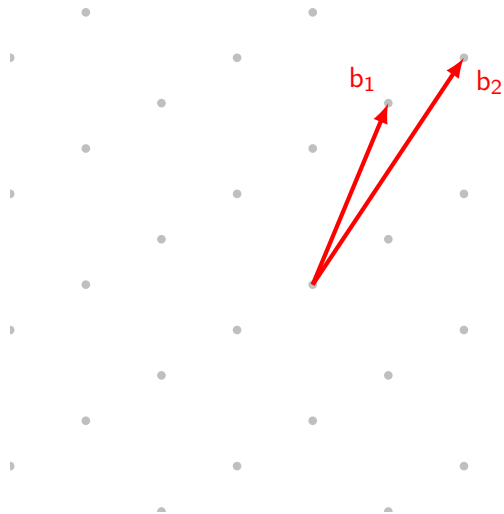
- Paper: gate level.
- This talk: overview.
- Quantum computers use quantum bits, **qubits**.

- We interact with qubits using quantum **gates**.

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- We interact with qubits using quantum **gates**.
- Quantum efficiency: T-gates or T-depth.

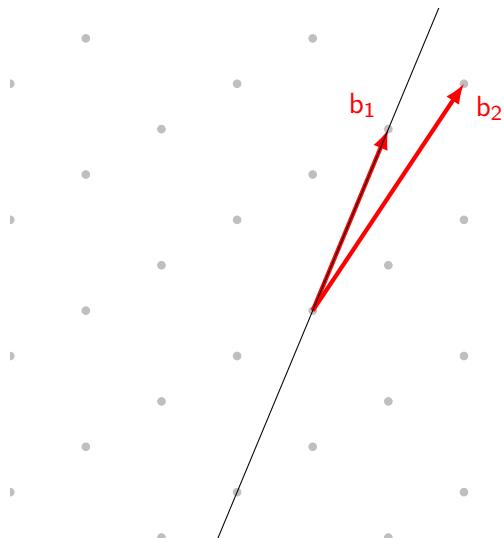
Enumeration



Visualization idea: Thijs
Laarhoven.

Enumeration

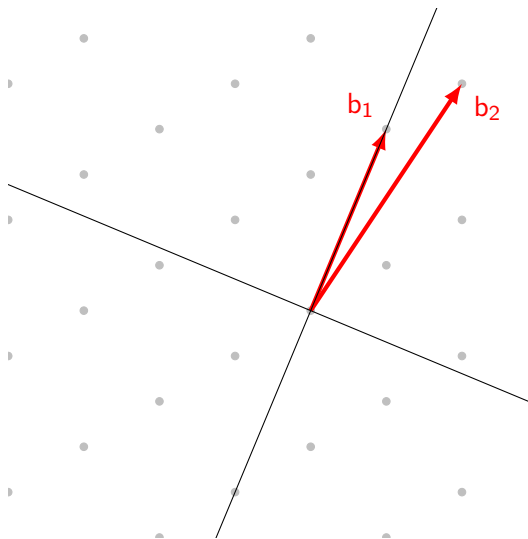
- Pick one direction.



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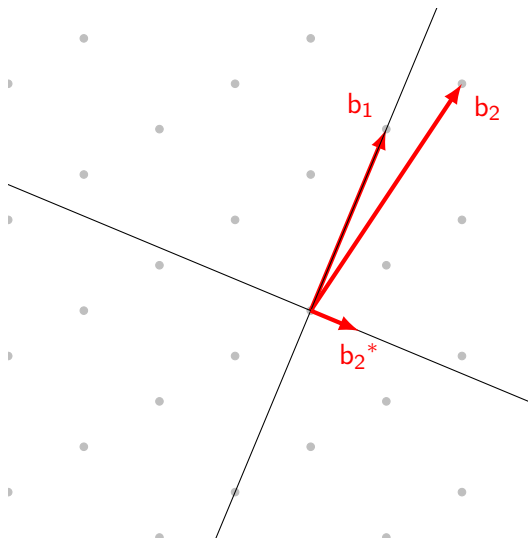
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- Consider directions orthogonal to it.



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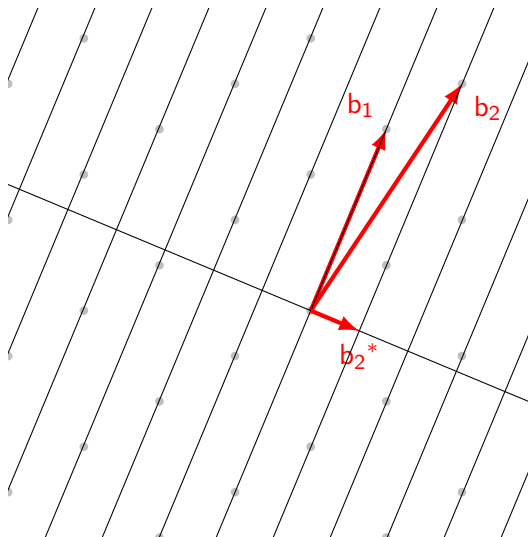
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- Consider directions orthogonal to it.
- Project other vector(s).



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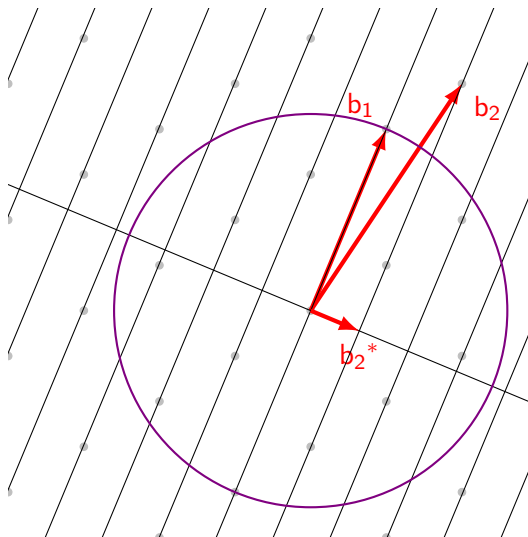
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- Make a grid parallel to b_1 spaced by the length of b_2^* .



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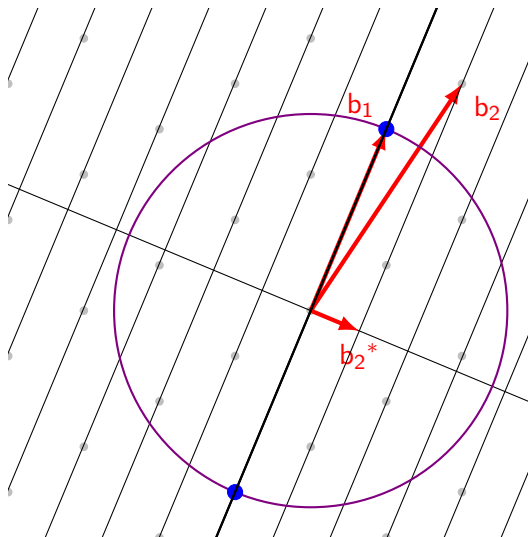
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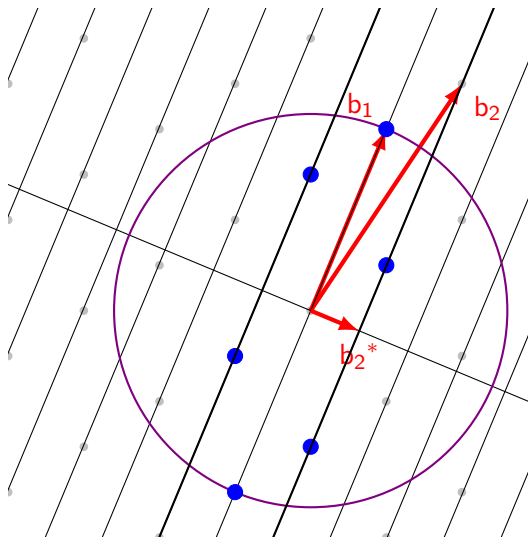
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- For each multiple of $\|b_2^*\|$ find all lattice points on that line.



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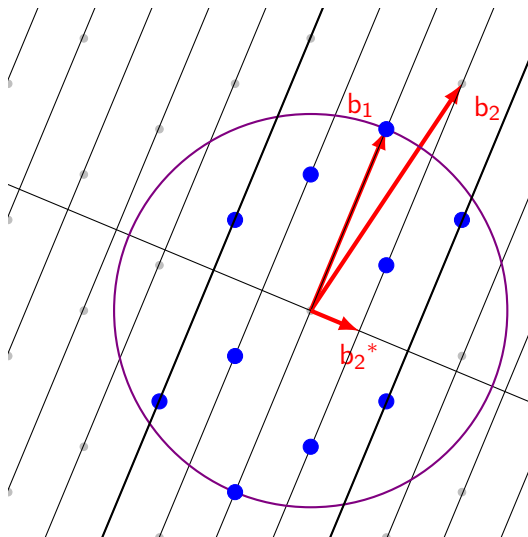
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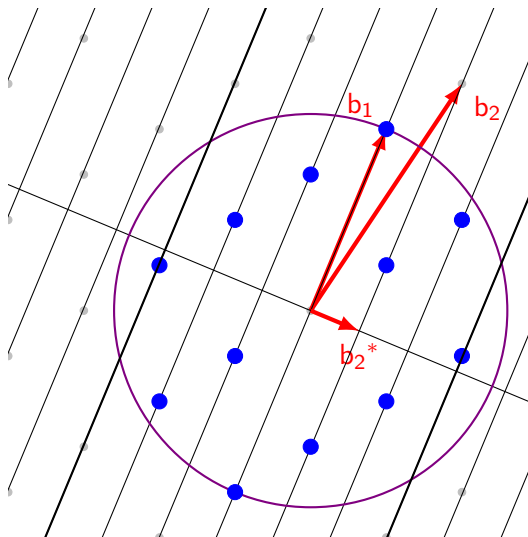
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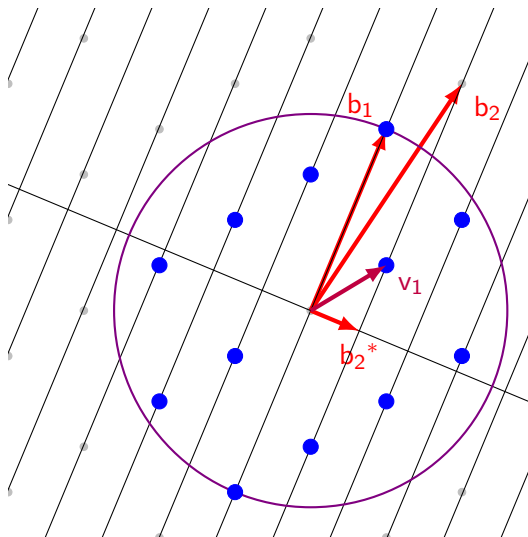
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- Output the shortest vector in the sphere.



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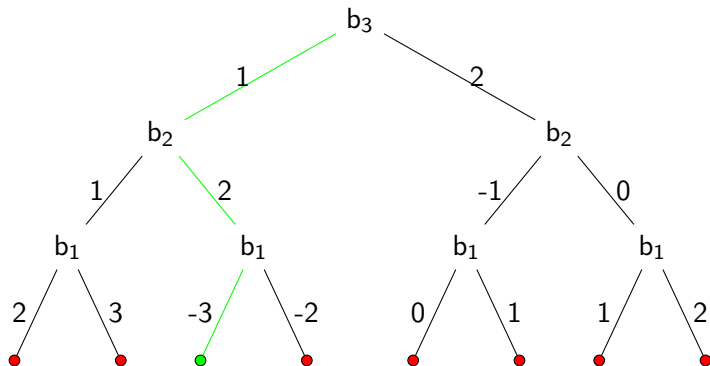
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Naive tree search

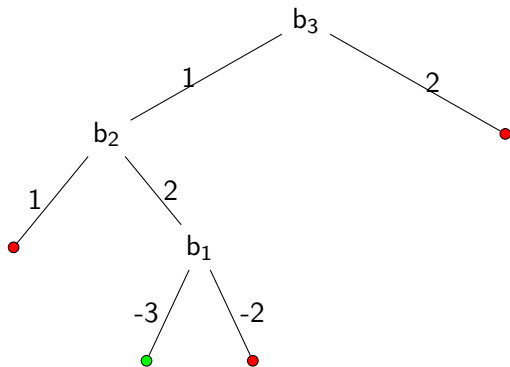
Our problem can be modelled as a tree.



Where the green node corresponds to the shortest vector $-3\mathbf{b}_1 + 2\mathbf{b}_2 + \mathbf{b}_3$.

Backtracking: idea

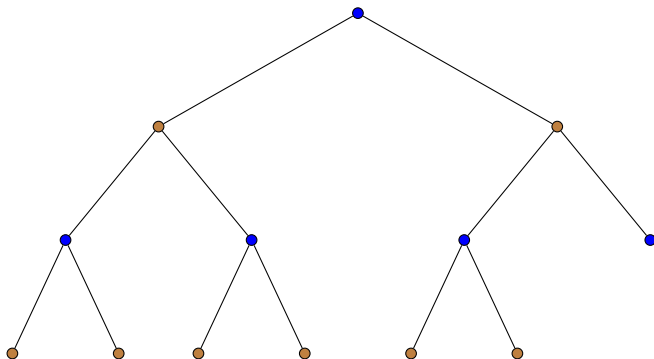
We need to find some way to reduce the number of nodes in the tree.



At each level call an oracle/predicate, this is called backtracking.

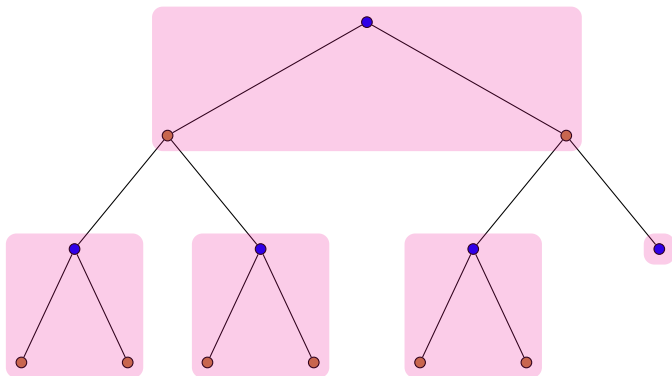
Quantum backtracking

Montanaro '18: split the tree into **odd** and **even** distance from the root.



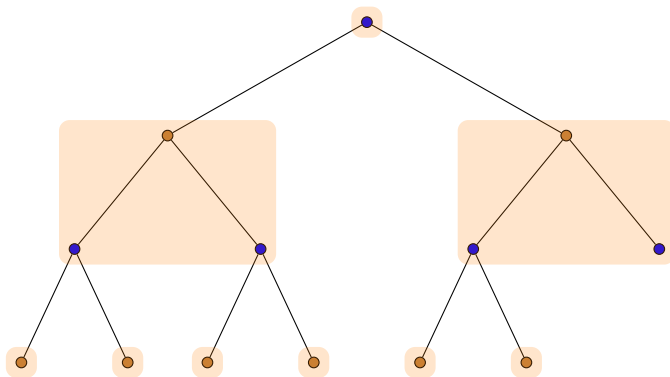
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Each step consists of going over the **even distance nodes and their children**.



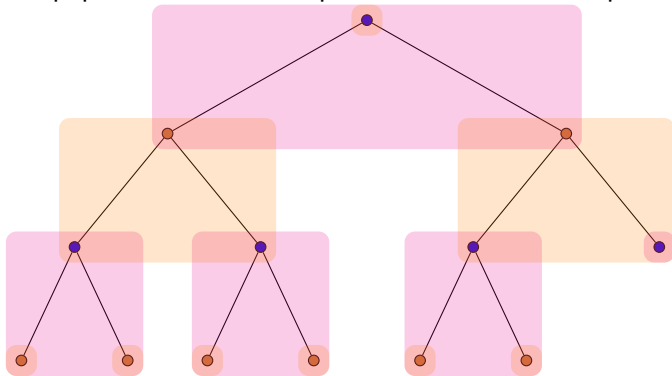
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Each step consists of going over the **even distance nodes and their children**.
And going over the **odd distance nodes and their children** (and the root).
Part of our paper: circuit level implementation of this step, called $R_B R_A$.



Overall Circuit

Montanaro's algorithm uses the phase estimation of the operator $U = R_B R_A$ on the root of the subtrees to detect a marked solution

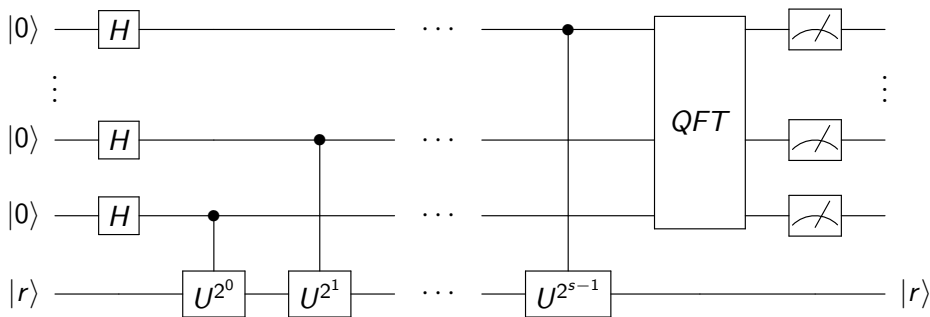


Figure: General circuit for phase estimation where $U := R_B R_A$.

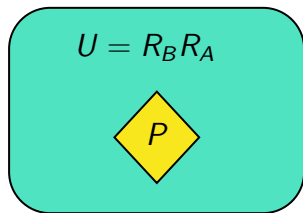
Our circuit design and its resource estimation

Overall Picture

The circuit design contains two main components

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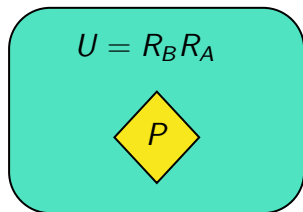


U : Quantum walk operator

P : Ensuring if the walk is correct

Overall Picture

The circuit design contains two main components



U : Quantum walk operator

P : Ensuring if the walk is correct

The predicate P will ensure the coefficients v_i satisfy

$$\sum_{j \geq n+1-l} \left(\sum_{i \geq j} \mu_{i,j} \cdot v_i \right)^2 \cdot \|\mathbf{b}_j^*\|^2 \leq R^2,$$

where $R, \mu_{ij}, \|\mathbf{b}_j^*\|$ are precomputed classically.

Predicate Design in a nutshell

$$\underbrace{\sum_{j \geq n+1-\ell}}_{(IV) \text{Add}_{FF}} \left(\underbrace{\sum_{i \geq j}}_{(II) A_k} \underbrace{\mu_{i,j} \cdot v_i}_{(I)} \right)^2 \cdot \underbrace{\|\mathbf{b}_j^*\|^2}_{(III) \text{Mul}_{FF}} \leq R^2,$$

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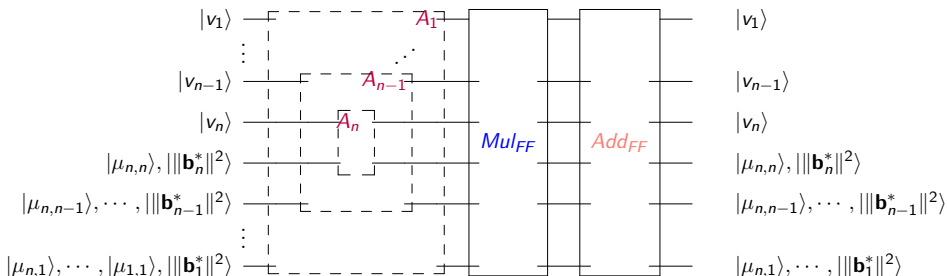


Figure: Components in the predicate circuit

Overall Circuit Design - Requirements

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n : $\dim(\mathcal{L})$ d : maximum degree of the tree B : bound of coefficients

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- Bounds:
 - We know $\mathcal{T} \leq n^{n/(2e+o(n))}$
 - Better when the basis is preprocessed, e.g., in HKZ-reduced basis $d \approx n^{(\ln n)/4}$

Our results

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Overall Resource Estimates

— T-depth —

$$32\sqrt{\mathcal{T}n} \cdot \left[16np(\log B + 2 \log n + p^{0.158}) + O(n \log B) + 8d^2 \log(d\sqrt{\mathcal{T}n}) + 4d^2 \log d + O(d^2) \right]$$

— T-size —

$$32\sqrt{\mathcal{T}n} \cdot \left[8(d+1)(14pn^2(B+1) + O(n^2B)) + 8d^2 \log(d\sqrt{\mathcal{T}n}) + 16d^2 \log d + O(d^2) \right]$$

Our results

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Practical Parameters

For cryptographic size n (e.g., $n \gtrsim 400$), it's reasonable to model
 $d \approx n, B \approx n^2, p \leq 3n, \log(\mathcal{T}) \approx cn \log n$

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$$\mathbf{T\text{-depth:}} \quad (128cn^3 \log n + O(n^{2.158}))\sqrt{\mathcal{T}n}$$

$$\mathbf{T\text{-size:}} \quad (10752n^6 + O(n^5))\sqrt{\mathcal{T}n}$$

Heuristic 1: $d \approx n, B \approx n^2$

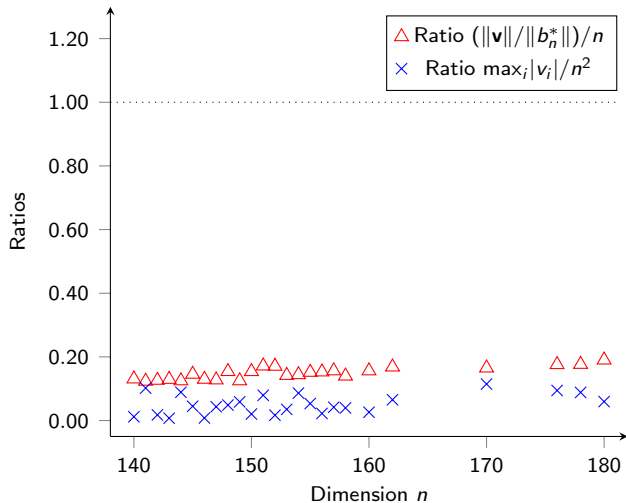


Figure: Bounds d and B , based on solved SVP Challenges.

Heuristic 2 - Bound $B \approx n^2$

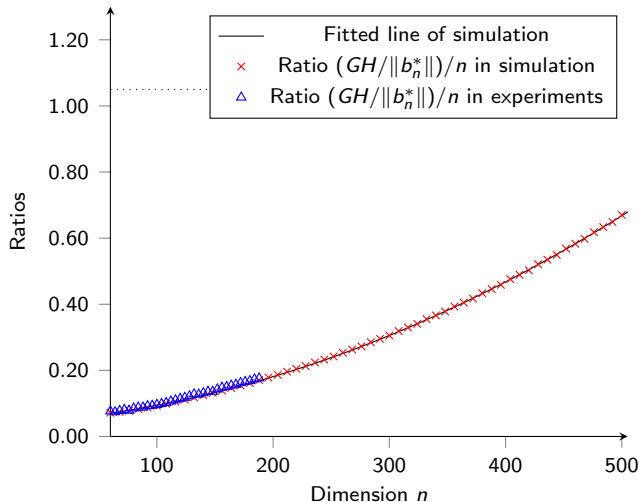


Figure: Bound B , based on BKZ experiments and simulations.

Heuristic 3 - $\mu_{i,j}$ have similar magnitude

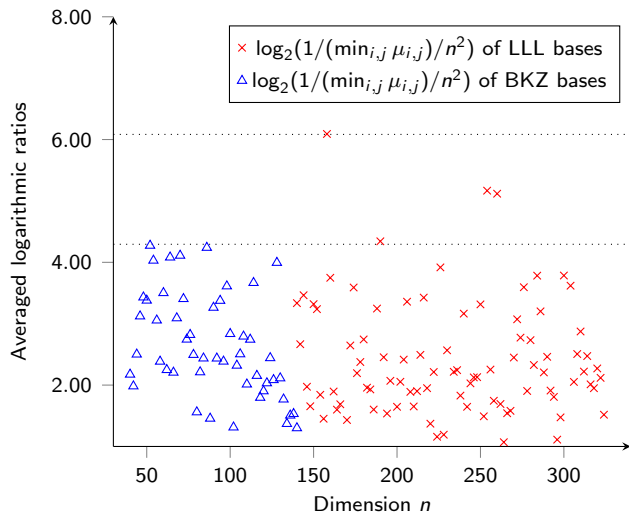


Figure: Experiments on the bound for $\mu_{i,j}$ in LLL/BKZ reduced basis.

Questions

- Can we make the phase estimation process parallel to reduce the depth?
- What are the resource estimates for extreme pruning?



The oracle receives questions now.
Do you have any questions?

- [ABB+17] Erdem Alkim, Nina Bindel, Johannes A. Buchmann, Özgür Dagdelen, Edward Eaton, Gus Gutoski, Juliane Krämer, and Filip Pawlega, *Revisiting TESLA in the quantum random oracle model*, 2017
- [ADPS16] Erdem Alkim, Léo Ducas, Thomas Pöppelmann, and Peter Schwabe, *Post quantum key exchange: A New Hope*, 2016
- [AK17] Andris Ambainis and Martins Kokainis, *Quantum algorithm for tree size estimation, with applications to backtracking and 2-player games*, 2017
- [ANS18] Yoshinori Aono, Phong Q. Nguyen, and Yixin Shen, *Quantum lattice enumeration and tweaking discrete pruning*, ASIACRYPT 2018, Part I (Thomas Peyrin and Steven Galbraith, eds.), 2018
- [Bel13] Aleksandrs Belovs, *Quantum walks and electric networks*, 2013
- [Mon18] Ashley Montanaro, *Quantum-walk speedup of backtracking algorithms*, 2018
- [PLP16] Rafael Pino, Vadim Lyubashevsky, and David Pointcheval, *The whole is less than the sum of its parts: Constructing more efficient lattice-based akes*, 2016