### The Computational Supersingular Isogeny Problem

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#### Goals of this talk

- 1. Highlight some of the complications with assessing the "cost" of known attacks on computational problems.
- 2. Highlight some of the difficulties in comparing the costs of classical and quantum attacks.
- 3. Justify key size recommendations for SIDH (and SIKE).

### Assessing hardness of comp. problems

1. Assess the cost of known attacks.

There are many factors to consider:

- ► Running time (number of arithmetic operations)
- Parallelizability
- Space requirements
- ▶ Communication costs
- Possibility of custom-designed machines
- Quantum resources
- 2. Assess the possibility of new attacks in the future.

### RSA vs. ECC key sizes

Running time of NFS for factoring *n*:

$$O(\exp^{(1.923+o(1))(\log n)^{1/3}(\log\log n)^{2/3}}).$$

Cost assessment is complicated:

- Communication costs for sieving (best done in cache/RAM)
- Linear algebra does not parallelize well
- Possibility of specialized hardware (TWINKLE, TWIRL)

In contrast, the cost of Pollard's rho attack on the ECDLP in  $E(\mathbb{F}_p)$  is straightforward to assess:

- ► Expected running time is  $\sqrt{\pi n}/2$   $(n = \#E(\mathbb{F}_p) \approx p)$
- Perfectly parallelizable (van Oorschot-Wiener (VW))
- Negligible storage
- ▶ Negligible communication costs

### RSA vs. ECC key sizes

After much debate, NIST issued the following key size recommendations in 2005 (SP 800-57) based on the running time of the fastest known (classical) attacks:

Bits of	Block	Hash	RSA	ECC
security	cipher	function	$\log_2 n$	$\log_2 p$
80	SKIPJACK	(SHA-1)	1024	160
112	Triple-DES	SHA-224	2048	224
128	AES-128	SHA-256	3072	256
192	AES-192	SHA-384	7680	384
256	AES-256	SHA-512	15360	512

TLS 1.2: 2048-bit RSA or 256-bit ECC for key agreement.

### Grover's search and AES

Let  $F: \{0,1\}^{\ell} \to \{0,1\}$  be a function such that:

- (i) F is efficiently computable; and
- (ii) F(x) = 1 for exactly p inputs  $x \in \{0, 1\}^{\ell}$ .

Grover's Search (1996) is a quantum algorithm that finds an  $x \in \{0,1\}^{\ell}$  with F(x) = 1 in  $2^{\ell/2}/p^{1/2}$  evaluations of F.

Key recovery: Consider AES with an  $\ell$ -bit key. Suppose that we have r known plaintext-ciphertext pairs  $(m_i, c_i)$ , where r is such that the expected number of false keys is very close to 0.

Define  $F: \{0,1\}^{\ell} \to \{0,1\}$  by F(k) = 1 if  $\mathsf{AES}_k(m_i) = c_i$  for all  $1 \le i \le r$ ; and F(k) = 0 otherwise.

Then Grover's search (with p=1) can find the secret key k in  $2^{\ell/2}$  operations.

Grover's search is often used to justify moving from AES-128 to AES-256.

### Quantum resource estimates (AES-128)

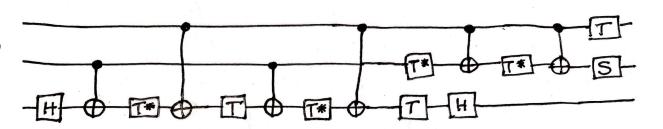
Grassl-Langenberg-Roetteler-Steinwandt (PQCrypto 2016)

▶ # circuits: 1

▶ # qubits: 2,953

• # gates:  $2^{87}$ 

▶ depth: 2<sup>81</sup>



NIST: Quantum attacks are restricted to a fixed circuit depth, called MAXDEPTH. Plausible values for MAXDEPTH:

- ≥ 2<sup>40</sup> gates (approx. # of gates that presently envisioned quantum computing architectures are expected to serially perform in a year).
- ≥ 2<sup>64</sup> gates (approx. # of gates that current classical computing architectures can perform serially in a decade).
- 2<sup>96</sup> gates (approx. # of gates that atomic scale qubits with speed of light propagation times could perform in a millennium).

The attack needs to be parallelized.

### Grover's search doesn't parallelize well

Optimal strategy (Zalka 1999): Divide the search space into M subsets, each of size  $2^{\ell}/M$ . Each of the M processors performs Grover's search on one subset.

Running time (per processor):  $2^{\ell/2}/\sqrt{M}$ .

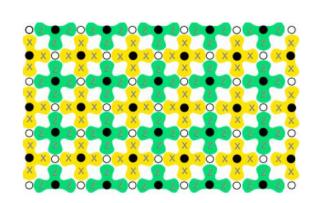
depth:	$2^{81}$	$2^{40}$	$2^{48}$	$2^{64}$
# circuits:	1	$2^{82}$	$2^{66}$	$2^{34}$
# qubits/circuit:	2,953	2,953	2,953	2,953
# gates/circuit:	$2^{87}$	$2^{46}$	$2^{54}$	$2^{70}$
Total # gates:	$2^{87}$	$2^{128}$	$2^{120}$	$2^{104}$

### Quantum error correction

Self-correcting quantum memory may not exist.

#### Actively-controlled quantum memories:

▶ To protect a circuit of depth D and width W, a surface code requires  $\Theta(\log^2(DW))$  physical qubits per logical qubit.



► The active error correction is applied with a classical processor in a regular cycle (e.g. once every 200*ns*).

arxiv.org/abs/1208.0928

- ▶ The overall cost of surface code computation is  $\Omega(\log^2(DW))$  RAM operations per logical qubit per layer of logical circuit depth.
- Quantum error correction has large overhead.
- This explains why DW-cost is a realistic cost measure for a quantum algorithm.

### AES-128 security, revisited

Quantum # Classical #

depth:  $2^{40}$  depth:  $2^{35}$  AES ops

circuits:  $2^{82}$  processors:  $2^{93}$ 

qubits/circuit: 2,953

gates/circuit:  $2^{46}$  gates/processor:  $2^{50}$ 

Total gates:  $2^{128}$  Total gates:  $2^{143}$ 

- ▶ The  $2^{93}$  classical processors used for error correction could be repurposed to perform exhaustive key search in time  $2^{35}$  AES operations.
- ► It isn't clear then that Grover's search is more effective than classical exhaustive search in breaking AES-128.
- ► Nevertheless, since AES-256 is only marginally slower than AES-128, it is reasonable to move from AES-128 to AES-256.

### **NIST Category 1**

- ► Any attack must require computational resources comparable to or greater than those required for key search on AES-128.
- ...with respect to all metrics that NIST deems to be potentially relevant to practical security.
- NIST intends to consider a variety of possible metrics, reflecting different predictions about the future development of quantum and classical computing technology.
- Fixed circuit depth (MAXDEPTH)
- ▶ Cost metric: Number of gates
  - 2<sup>143</sup> classical gates
  - $2^{170}$ /MAXDEPTH quantum gates ( $2^{130}$  quantum gates if MAXDEPTH =  $2^{40}$ )
- Category 3 (AES-192):
  - 2<sup>207</sup> classical gates, 2<sup>233</sup>/MAXDEPTH quantum gates

#### Hash function collisions: Grover

Let  $H: \{0,1\}^* \to \{0,1\}^{\ell}$  be an  $\ell$ -bit hash function.

- ▶ A collision is a pair (x, y) with H(x) = H(y) and  $x \neq y$ .
- ▶ Define  $F: \{0,1\}^{\ell+c} \times \{0,1\}^{\ell+c} \to \{0,1\}$  by

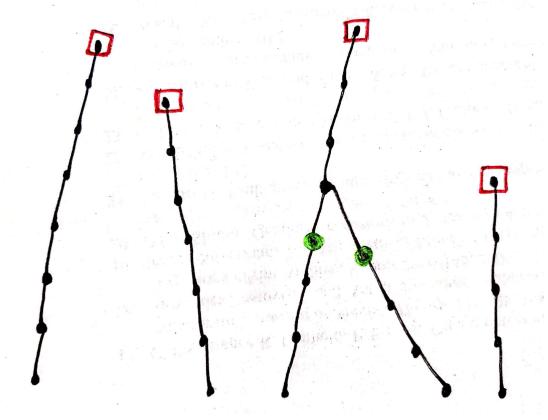
$$F(x,y) = \left\{ \begin{array}{ll} 0, & \text{if } H(x) \neq H(y), \\ 1, & \text{if } H(x) = H(y) \text{ and } x \neq y. \end{array} \right.$$

The expected number of collisions is  $\approx 2^{\ell+2c}$ .

- ▶ Grover's search with M processors can find a collision in time  $2^{\ell/2}/\sqrt{M}$ .
- ▶ If  $M = 2^{\ell/3}$ , the time is  $2^{\ell/3}$ .
- $\blacktriangleright$  So, collisions for SHA-256 can be found in time  $2^{85.3}$ .

# Collision finding: Classical (VW)

- The fastest generic classic finding algorithm for finding a collision for  $f: S \to S$  (where #S = N) is due to van Oorschot-Wiener (VW).
- $\blacktriangleright$  Let  $\theta$  be the distinguishing probability for elements in S.

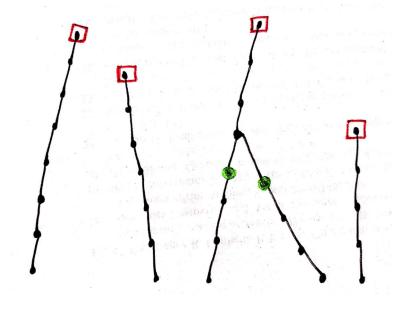


▶ Expected time  $\approx \sqrt{\pi N/2} + \frac{2.5}{\theta}$ , Space  $\approx \theta \sqrt{\pi N/2}$ .

### Hash function collisions: VW

The VW algorithm for finding a collision for  $H: \{0,1\}^{\ell} \to \{0,1\}^{\ell}$ :

- ▶ Has expected running time  $\sqrt{\pi 2^\ell/2} \approx 2^{\ell/2}$
- ▶ Is perfectly parallelizable
- ▶ Has negligible storage
- Has negligible communication costs



With  $M=2^{\ell/3}$  processors, a collision can be found in time  $2^{\ell/6}$ . (Grover's search takes time  $2^{\ell/3}$ .)

### Hash function collisions: BHT

Brassard-Høyer-Tapp (BHT) (1998)

Fix  $x_1, x_2, \dots, x_N \in \{0, 1\}^{\ell + c}$ . Define  $F : \{0, 1\}^{\ell + c} \to \{0, 1\}$  by

$$F(y) = \begin{cases} 1, & \text{if } H(y) = H(x_i) \text{ and } y \neq x_i \text{ for some } i, \\ 0, & \text{otherwise.} \end{cases}$$

Grover's search (one processor) finds a collision in time

$$N + 2^{\ell/2}/N^{1/2}$$
.

If  $N=2^{\ell/3}$ , this time is  $2^{\ell/3}$ .

Bernstein (2009) argued that BHT is inferior to VW since:

- ▶ Memory access is expensive (on the order of  $N^{1/2}$ ).
- Quantum memory is expensive.

### NIST Category 2

- ► Any attack must require computational resources comparable to or greater than those required for collision search on SHA-256.
- ▶ Cost metric: Number of gates
  - 2<sup>146</sup> classical gates
- ► Category 1:
  - ullet  $2^{143}$  classical gates,  $2^{170}/\text{MAXDEPTH}$  quantum gates.
- "...NIST will assume that the five security strengths are correctly ordered in terms of practical security."
- Category 4 (SHA-384):
  - 2<sup>210</sup> classical gates

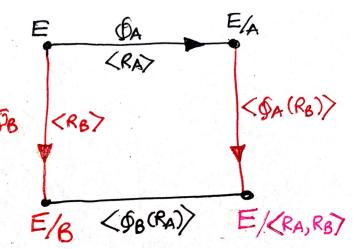
### SIDH parameters

Unauthenticated key agreement scheme (Jao & De Feo, 2011).

- ▶ Let  $p = 2^{e_A}3^{e_B} 1$  be a prime with  $2^{e_A} \approx 3^{e_B} \approx p^{1/2}$ .
- Let E be a (supersingular) elliptic curve defined over  $\mathbb{F}_{p^2}$  with  $\#E(\mathbb{F}_{p^2})=(p+1)^2$ .
- ▶ Then  $E(\mathbb{F}_{p^2}) \cong \mathbb{Z}_{p+1} \oplus \mathbb{Z}_{p+1}$ , whence  $E[2^{e_A}], E[3^{e_B}] \subseteq E(\mathbb{F}_{p^2})$ . Let  $\{P_A, Q_A\}, \{P_B, Q_B\}$  be bases for  $E[2^{e_A}], E[3^{e_B}]$ .
- ▶ Write  $(\ell, e)$  to mean either  $(2, e_A)$  or  $(3, e_B)$ . Similarly for  $\{P, Q\}$ .
- For each order- $\ell^e$  subgroup S of  $E[\ell^e]$ , there exists a degree- $\ell^e$  (separable) isogeny  $\phi_S: E \to E/S$  over  $\mathbb{F}_{p^2}$  with kernel S. The isogeny is unique up to isomorphism and can be efficiently computed.
- ▶ Hence, the number of degree- $\ell^e$  isogenies  $\phi: E \to E'$  is  $(\ell+1)\ell^{e-1} \approx p^{1/2}$ .
- $\triangleright$  SIDH parameters:  $e_A, e_B, p, E, P_A, Q_A, P_B, Q_B$ .

### SIDH

- 1. Alice selects a random order- $2^{e_A}$  point  $R_A = m_A P_A + n_A Q_A$  and computes the isogeny  $\phi_A : E \to E/A$ , where  $A = \langle R_A \rangle$ . Alice transmits E/A,  $\phi_A(P_B)$ ,  $\phi_A(Q_B)$  to Bob.
- 2. Bob similarly transmits E/B,  $\phi_B(P_A)$ ,  $\phi_B(Q_A)$  to Alice.
- 3. Alice computes  $\phi_B(R_A) = m_A \phi_B(P_A) + n_A \phi_B(Q_A)$  and  $(E/B)/\langle \phi_B(R_A) \rangle$ .
- 4. Similarly, Bob computes  $(E/A)/\langle \phi_A(R_B) \rangle$ .
- 5. The compositions of isogenies  $E \to E/A \to (E/A)/\langle \phi_A(R_B) \rangle$  and  $E \to E/B \to (E/B)/\langle \phi_B(R_A) \rangle$  have kernel  $\langle R_A, R_B \rangle$ .
- 6. The shared secret is the j-invariant of these curves.



### **CSSI**

- ► Hardness of the Computational SuperSingular Isogeny problem (CSSI) is necessary for the security of SIDH:
- ▶ Given the SIDH parameters  $e_A$ ,  $e_B$ , p, E,  $P_A$ ,  $Q_A$ ,  $P_B$ ,  $Q_B$ , and E/A,  $\phi_A(P_B)$ ,  $\phi_A(Q_B)$ , compute a degree- $2^{e_A}$  isogeny  $\phi_A: E \to E/A$ .
- ▶ We will study a simplification of the problem that omits the auxiliary points  $\phi_A(P_B)$  and  $\phi_A(Q_B)$ :

CSSI: Given the SIDH parameters  $e_A$ ,  $e_B$ , p, E,  $P_A$ ,  $Q_A$ ,  $P_B$ ,  $Q_B$ , and E/A, compute a degree- $2^{e_A}$  isogeny  $\phi_A: E \to E/A$ .

CSSI was first formulated by Charles, Goren and Lauter in 2005.

## Supersingular isogeny graphs

- ▶ Let R denote the set of all j-invariants of supersingular elliptic curves over  $\mathbb{F}_{p^2}$ ; then  $\#R \approx p/12 \approx \ell^{2e}$ .
- ► The supersingular isogeny graph  $\mathcal{G}_{\ell}(\mathbb{F}_{p^2})$  has vertex set R, and edges  $(j_1, j_2)$  with multiplicity equal to the multiplicity of  $j_2$  as a root of the modular polynomial  $\Phi_{\ell}(j_1, Z)$  over  $\mathbb{F}_{p^2}$ .
- ▶  $\mathcal{G}_{\ell}$  is  $(\ell+1)$ -regular.
- ▶ Pizer showed that  $\mathcal{G}_{\ell}(\mathbb{F}_{p^2})$  is a Ramanujan graph:
  - Optimal expander graph.
  - The endpoint of a random walk approximates the uniform distribution after  $O(\log v)$  steps, where  $v \approx \ell^{2e}$ .
- ▶ Let  $E_1 = E$ ,  $j_1 = j(E_1)$ ,  $E_2 = E/A$ ,  $j_2 = j(E_2)$ .
- ▶ The CSSI problem is to find a path of length e from  $j_1$  to  $j_2$  in  $\mathcal{G}_{\ell}(\mathbb{F}_{p^2})$ .

#### **CSSI** attacks

The fastest CSSI attacks that were first identified were:

- ▶ Classical: Meet-in-the-middle  $O(p^{1/4})$ .
- **Quantum:** Tani's algorithm  $O(p^{1/6})$ .

Consequently, primes p of bitlength  $\approx 768$  were recommended to attain the 128-bit security level.

However, both attacks have significant storage requirements:  $p^{1/4}$  and  $p^{1/6}$ , respectively.

Thus, a concrete cost analysis might justify using smaller p while still attaining the 128-bit security level.

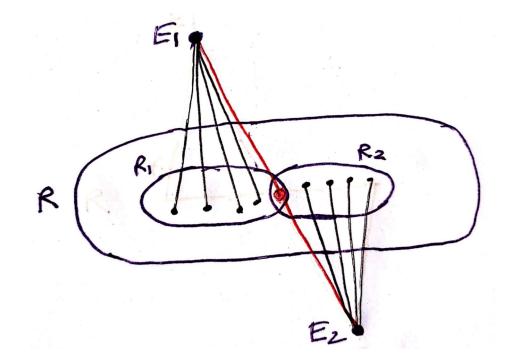
# Meet-in-the-middle (MITM) attack

- ▶ Denote the number of order- $\ell^{e/2}$  subgroups of  $E[\ell^e]$  by  $N \approx p^{1/4}$ .
- For i=1,2, let  $R_i$  denote that set of j-invariants of elliptic curves over  $\mathbb{F}_{p^2}$  that are  $\ell^{e/2}$ -isogenous to  $E_i$ .
- ► Then one expects that  $\#R_1 \approx \#R_2 \approx N \ll \#R$ . It is also reasonable to assume that  $\#(R_1 \cap R_2) = 1$ .

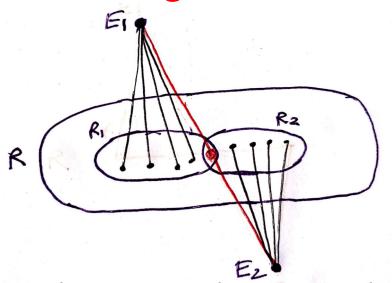
#### **MITM**

Time: 2N

Space: N



# VW golden collision finding



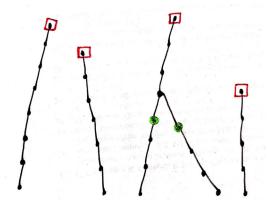
van Oorschot & Wiener, 1996

Adj et al., 2018

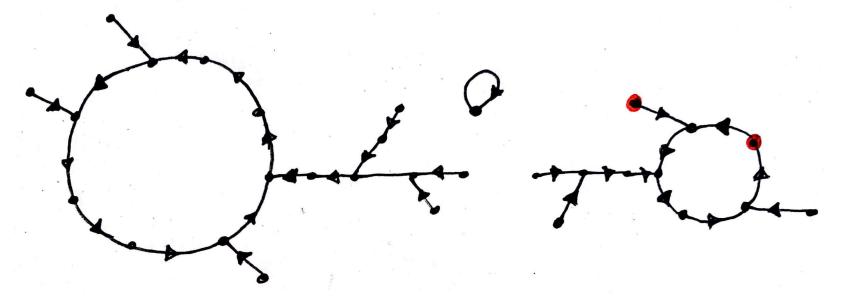
- ▶ Let  $I = \{1, 2, ...., N\}$  and  $S = \{1, 2\} \times I$ .
- For i = 1, 2, let:  $A_i = \text{all order-}\ell^{e/2}$  subgroups of  $E_i[\ell^e]$ .  $h_i: I \to A_i$  bijections.  $f_i: A_i \to R_i, \quad f_i(A_i) = j(E_i/A_i).$
- ▶ Let  $g: R \rightarrow S$  be a random function
- ▶ Define  $f: S \to S$  by  $f: (i, y) \mapsto g(f_i(h_i(y)))$
- ▶ The expected number of (unordered) collisions for f is  $\approx N$ .
- ▶ Suppose  $j(E_1/A_1) = j(E_2/A_2)$ ,  $y_1 = h_1^{-1}(A_1)$ ,  $y_2 = h_2^{-1}(A_2)$ .
- $\blacktriangleright$  We seek the golden collision  $(1, y_1)$ ,  $(2, y_2)$ .

## VW golden collision finding

Main idea: Find many collisions, until the gold. collision is obtained.



Problem: The golden collision might be hard to find.



Solution: Change f periodically (by changing g).

## Finding the golden collision

- **Storage:** Space for w triples  $(x_{i,a}, a, x_{i,0})$ .
- $\blacktriangleright$  Set  $\theta = \alpha \sqrt{w/(2N)}$ .
- ▶ Use each version of f to produce  $\beta w$  distinguished points.
- Store a distinguished point in a memory cell determined by hashing it.
- $\blacktriangleright$  For  $\alpha = 2.25$ ,  $\beta = 10$ :
  - One expects 1.3w collisions per function version.
  - One expects 1.1w distinct collisions per function version.
  - The expected time to find the golden collision is

$$\approx \frac{N}{1.1w} \cdot 10w \cdot \frac{2N}{2.25\sqrt{w}} \approx N^{3/2}/w^{1/2} \approx p^{3/8}/w^{1/2}.$$

The algorithm parallelizes well.

### MITM vs. VW

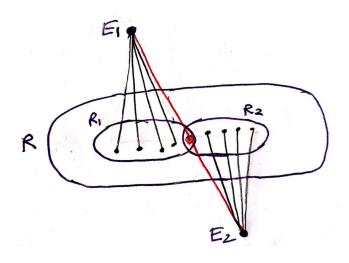
MITM (time-memory tradeoff):

Time:  $N^2/w$  Space: w

➤ VW golden collision search:

Time:  $N^{3/2}/w^{1/2}$  Space: w

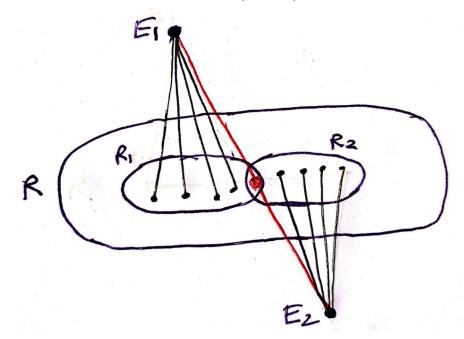
► Conclusion: VW is superior to MITM for w < N.



### Quantum attacks

CSSI can be viewed as an instance of the claw finding problem:

Consider  $f: X \to Z$ ,  $g: Y \to Z$  with  $|X| = |Y| = N \ll |Z|$ . Given black-box access to f and g, find  $(x, y) \in X \times Y$  with f(x) = g(y).



In CSSI:  $X = \text{degree-}\ell^{e/2}$  isogenies originating at  $E_1$ ,  $Y = \text{degree-}\ell^{e/2}$  isogenies originating at  $E_2$ , Z = set of j-invariants of all supersingular elliptic curves, f,g record the j-invariants of the image curves, and there is exactly one claw.

#### Grover's search

- ▶ Define  $F: X \times Y \to Z$  by F(x,y) = 1 if f(x) = g(y), and F(x,y) = 0 otherwise.
- ▶ Grover's search can be used to find a claw in time  $\sqrt{N^2} \approx p^{1/4}$ .
- ▶ VW:  $N^{3/2}/(Mw^{1/2})$ , Grover:  $N/\sqrt{M}$ .
- **Example:** Consider  $\ell=2, \ e=216, \ N\approx 2^{108}, \ w=2^{80},$  MAXDEPTH= $2^{64}.$ 
  - Then VW total run time is  $2^{125.7}$  degree- $2^{108}$  isogeny computations.
  - An optimistic estimate for the depth of a quantum circuit for a degree- $2^{108}$  isogeny computation is  $2^{14}$ .
  - One quantum circuit can perform  $2^{50}$  isogeny computations, so  $M=2^{116}$  circuits are required for Grover.
  - So, NIST's Category 1 requirements are met.

### Tani's algorithm

- ▶ The vertices of the Johnson graph J(X,T) are the T-subsets of X, with two subsets begin adjacent iff their intersection has size T-1.
- ► Tani: Perform a quantum random walk (with uniform probabilities) in  $G = J(X,T) \times J(Y,T)$ .
- ▶ The walk on G is a Markov process with uniform probabilities and spectral gap  $\delta \approx \frac{1}{T}$ .
- ▶ The proportion of vertices that contain a claw is

$$\epsilon = \left(\frac{\binom{N-1}{T-1}}{\binom{N}{T}}\right)^2 = \frac{T^2}{N^2}.$$

### Quantum random walk

#### Classical:

Construct a random vertex. (S)

Repeat  $O(\frac{1}{\epsilon})$  times:

Repeat  $O(\frac{1}{\delta})$  times:

Take one random step in G. (U)

Check if the current vertex contains a claw. (C)

Cost:  $O\left(S + \frac{1}{\epsilon} \left(\frac{1}{\delta}U + C\right)\right)$ .

Quantum (Magniez-Nayak-Roland-Santha):

Create a superposition of random vertices. (S)

Repeat  $O(\frac{1}{\sqrt{\epsilon}})$  times:

Repeat  $O(\frac{1}{\sqrt{\delta}})$  times:

Take one "quantum" random step in G. (U)

"Quantum" check for a claw. (C)

Cost: 
$$O\left(S + \frac{1}{\sqrt{\epsilon}} \left(\frac{1}{\sqrt{\delta}}U + C\right)\right)$$
.

## Tani: query optimal

$$\text{Cost: } O\left(S + \tfrac{1}{\sqrt{\epsilon}} \left( \tfrac{1}{\sqrt{\delta}} U + C \right) \right), \quad \epsilon = \tfrac{T^2}{N^2}, \quad \delta \approx \tfrac{1}{T}.$$

#### Jaques & Schanck (CRYPTO 2019)

- ► Cost =  $O(T + \frac{N}{T^{1/2}})$ .
- ▶ The cost is optimized when  $T \approx N^{2/3}$ , yielding a running time  $\approx N^{2/3} = p^{1/6}$  degree- $\ell^{e/2}$  isogeny computations.
- ▶ A vertex has size 2T, so  $p^{1/6}$  classical processors are needed in the active error control model.
- ▶ These  $p^{1/6}$  processors (and  $p^{1/6}$  classical memory) can be used with VW golden collision search with running time

$$\frac{p^{3/8}}{p^{1/6} \cdot p^{1/12}} = p^{1/8}.$$

### Tani: Non-asymptotic cost estimates

#### Jaques & Schanck (CRYPTO 2019)

- ► The optimal T is chosen based on memory access costs and oracle costs.
- ► Tani suffers from the same parallelization issues as Grover (however, the naive parallelization strategy may not be optimal).
- Note that Tani's algorithm with T=1 is essentially the same as Grover's algorithm.
- Conclusion: Tani is costlier than VW
  - with MAXDEPTH =  $2^{64}$
  - DW-cost
  - G-cost

### Concrete parameters for SIDH

- ▶ 128-bit security-level (also: NIST Categories 1 and 2)
  - $p = p434 = 2^{216}3^{137} 1$ .
  - VW:  $w = 2^{80}$ ,  $\theta \approx 1/2^{13.6}$ , Time =  $2^{125.7}$  (isog.).

Protocol phase		CLN + enhancements $p_{751}$ $p_{434}$	
Key	Alice	26.9	5.3
Gen.	Bob	30.5	6.0
Key	Alice	24.9	5.0
Gen.	Bob	28.6	5.8

(Times are in  $10^6$  clock cycles on an Intel Core i7-6700)

- ▶ 192-bit security level (also: NIST Categories 3 and 4)
  - $p = p610 = 2^{305}3^{192} 1$ .
  - VW:  $w = 2^{80}$ ,  $\theta \approx 1/2^{35.9}$ , Time =  $2^{192.6}$  (isog.).
- ▶ p434 and p610 have been included in the Round 2 SIKE submission to the NIST PQC competition.

#### Questions

- Can the analysis of VW golden collision finding be made more rigorous?
- ► Can the CSSI problem be formulated as one of finding a single collision (not a golden collision)?
- Are the assumptions on classical resources and quantum resources reasonable for making long-term key-size recommendations?
- ► Can Tani's algorithm be parallelized in a cost-effective way?

#### References

1. G. Adj et al.

"On the cost of computing isogenies between supersingular elliptic curves" SAC 2018.

- S. Jaques and J. Schanck "Quantum cryptanalysis in the RAM model: Claw-finding attacks on SIKE" CRYPTO 2019.
- 3. S. Jaques "Quantum cost models for cryptanalysis of isogenies" Master's thesis, http://hdl.handle.net/10012/14612