# The supersingular isogeny problem in genus 2 and beyond 

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#### Abstract

Let $A / \overline{\mathbb{F}}_{p}$ and $A^{\prime} / \overline{\mathbb{F}}_{p}$ be superspecial principally polarized abelian varieties of dimension $g>1$. For any prime $\ell \neq p$, we give an algorithm that finds a path $\phi: A \rightarrow A^{\prime}$ in the $(\ell, \ldots, \ell)$-isogeny graph in $\widetilde{O}\left(p^{g-1}\right)$ group operations on a classical computer, and $\widetilde{O}\left(\sqrt{p^{g-1}}\right)$ calls to the Grover oracle on a quantum computer. The idea is to find paths from $A$ and $A^{\prime}$ to nodes that correspond to products of lower dimensional abelian varieties, and to recurse down in dimension until an elliptic path-finding algorithm (such as Delfs-Galbraith) can be invoked to connect the paths in dimension $g=1$. In the general case where $A$ and $A^{\prime}$ are any two nodes in the graph, this algorithm presents an asymptotic improvement over all of the algorithms in the current literature. In the special case where $A$ and $A^{\prime}$ are a known and relatively small number of steps away from each other (as is the case in higher dimensional analogues of SIDH), it gives an asymptotic improvement over the quantum claw finding algorithms and an asymptotic improvement over the classical van Oorschot-Wiener algorithm.


## 1 Introduction

Isogenies of supersingular elliptic curves are now well-established in cryptography, from the Charles-Goren-Lauter hash function [10] to Jao and De Feo's SIDH key exchange [27] and beyond [2|21|12|13]. While the security of isogenybased cryptosystems depend on the difficulty of a range of computational problems, the fundamental one is the isogeny problem: given supersingular elliptic curves $\mathcal{E}_{1}$ and $\mathcal{E}_{2}$ over $\mathbb{F}_{p^{2}}$, find a walk in the $\ell$-isogeny graph connecting them.

One intriguing aspect of isogeny-based cryptography is the transfer of ellipticcurve techniques from classic discrete-log-based cryptography into the postquantum arena. In this spirit, it is natural to consider cryptosystems based on isogeny graphs of higher-dimensional abelian varieties, mirroring the transition from elliptic (ECC) to hyperelliptic-curve cryptography (HECC). Compared with elliptic supersingular isogeny graphs, the higher-dimensional graphs have more vertices and higher degrees for a given $p$, which allows some interesting tradeoffs (for example: in dimension $g=2$, we get the same number of vertices with a $p$ of one-third the bitlength).

For $g=2$, Takashima 36 and Castryck, Decru, and Smith 7] have defined CGL-style hash functions, while Costello [11] and Flynn and Ti [19] have already proposed SIDH-like key exchanges. Generalizations to dimensions $g>2$, using isogeny algorithms such as those in [4, are easy to anticipate; for example, a family of hash functions on isogeny graphs of superspecial abelian varieties with real multiplication was hinted at in 9 .

So far, when estimating security levels, these generalizations assume that the higher-dimensional supersingular isogeny problem is basically as hard as the elliptic supersingular isogeny problem in graphs of the same size. In this article, we show that this assumption is false. The general supersingular isogeny problem can be partially reduced to a series of lower-dimensional isogeny problems, and thus recursively to a series of elliptic isogeny problems.

Theorem 1. There exists a classical algorithm which, given a prime $\ell$ and superspecial abelian varieties $\mathcal{A}_{1}$ and $\mathcal{A}_{2}$ of dimension $g$ over $\overline{\mathbb{F}}_{p}$ with $p \neq \ell$, succeeds with probability $\geq 1 / 2^{g-1}$ in computing a composition of $(\ell, \ldots, \ell)$-isogenies from $\mathcal{A}_{1}$ to $\mathcal{A}_{2}$, running in expected time $\widetilde{O}\left(\left(p^{g-1} / P\right)\right)$ on $P$ processors as $p \rightarrow \infty$ (with $\ell$ fixed).

Given that these graphs have $O\left(p^{g(g+1) / 2}\right)$ vertices, the expected runtime for generic random-walk algorithms is $\widetilde{O}\left(p^{g(g+1) / 4} / P\right)$. Our algorithm therefore represents a substantial speedup, with nontrivial consequences for cryptographic parameter selection $\sqrt[3]{ }$ We also see an improvement in quantum algorithms:

Theorem 2. There exists a quantum algorithm which, given a prime $\ell$ and superspecial abelian varieties $\mathcal{A}_{1}$ and $\mathcal{A}_{2}$ of dimension $g$ over $\overline{\mathbb{F}}_{p}$ with $p \neq \ell$, computes a composition of $(\ell, \ldots, \ell)$-isogenies from $\mathcal{A}_{1}$ to $\mathcal{A}_{2}$ running in expected time $\widetilde{O}\left(\sqrt{p^{g-1}}\right)$ as $p \rightarrow \infty$ (with $\ell$ fixed).

This reflects the general pattern seen in the passage from ECC to HECC: the dimension grows, the base field shrinks - and the mathematical structures become more complicated, which can ultimately reduce claimed security levels. Just as index calculus attacks on discrete logarithms become more powerful in higher genus, where useful structures appear in Jacobians [15|23|22|34, so interesting structures in higher-dimensional isogeny graphs provide attacks that become more powerful as the dimension grows. Here, the interesting structures are (relatively large) subgraphs corresponding to increasing numbers of elliptic factors in (polarized) abelian varieties. These subgraphs are relatively large, and so random-walking into them is relatively easy. We can then glue together elliptic isogenies, found with an elliptic path-finding algorithm, to form product isogenies between products of elliptic curves, and thus to solve the original isogeny problem. We will see that the path-finding problem in the superspecial graph gets asymptotically easier as the dimension grows.

[^0]Notation and conventions. Throughout, $p$ denotes a prime $>3$, and $\ell$ a prime not equal to $p$. Typically, $p$ is large, and $\ell \ll \log (p)$ is small enough that computing $(\ell, \ldots, \ell)$-isogenies of $g$-dimensional principally polarized abelian varieties (PPAVs) is polynomial in $\log (p)$. Similarly, we work with PPAVs in dimensions $g \ll \log p$; in our asymptotics and complexities, $g$ and $\ell$ are fixed. We say a function $f(X)$ is in $\widetilde{O}(g(X))$ if $f(X)=O(h(\log X) g(X))$ for some polynomial $h$.

## 2 The elliptic supersingular isogeny graph

An elliptic curve $\mathcal{E} / \overline{\mathbb{F}}_{p}$ is supersingular if $\mathcal{E}[p]\left(\overline{\mathbb{F}}_{p}\right)=0$. We have a number of efficient algorithms for testing supersingularity: see Sutherland [35] for discussion.

Supersingularity is isomorphism-invariant, and any supersingular $\mathcal{E}$ has $j$ invariant $j(\mathcal{E})$ in $\mathbb{F}_{p^{2}}$; and in fact the curve $\mathcal{E}$ can be defined over $\mathbb{F}_{p^{2}}$. We let

$$
S_{1}(p):=\left\{j(\mathcal{E}): \mathcal{E} / \mathbb{F}_{p^{2}} \text { is supersingular }\right\} \subset \mathbb{F}_{p^{2}}
$$

be the set of isomorphism classes of supersingular elliptic curves over $\overline{\mathbb{F}}_{p}$. It is well-known that

$$
\begin{equation*}
\# S_{1}(p)=\left\lfloor\frac{p}{12}\right\rfloor+\epsilon_{p} \tag{1}
\end{equation*}
$$

where $\epsilon_{p}=0$ if $p \equiv 1(\bmod 12), 2$ if $p \equiv-1(\bmod 12)$, and 1 otherwise.
Now fix a prime $\ell \neq p$, and consider the directed multigraph $\Gamma_{1}(\ell ; p)$ whose vertex set is $S_{1}(p)$, and whose edges correspond to $\ell$-isogenies between curves (again, up to isomorphism). The graph $\Gamma_{1}(\ell ; p)$ is $(\ell+1)$-regular: there are (up to isomorphism) $\ell+1$ distinct $\ell$-isogenies from a supersingular elliptic curve $\mathcal{E} / \mathbb{F}_{p^{2}}$ to other elliptic curves, corresponding to the $\ell+1$ order- $\ell$ subgroups of $\mathcal{E}[\ell]\left(\overline{\mathbb{F}}_{p}\right) \cong(\mathbb{Z} / \ell \mathbb{Z})^{2}$ that form their kernels. But since supersingularity is isogenyinvariant, the codomain of each isogeny is again supersingular; that is, the $\ell+1$ order- $\ell$ subgroups of $\mathcal{E}[\ell]$ are in bijection with the edges out of $j(\mathcal{E})$ in $\Gamma_{1}(\ell ; p)$.

Definition 1. A walk of length $n$ in $\Gamma_{1}(\ell ; p)$ is a sequence of edges $j_{0} \rightarrow j_{1} \rightarrow$ $\cdots \rightarrow j_{n}$. A path in $\Gamma_{1}(\ell ; p)$ is an acyclic (and, in particular, non-backtracking) walk: that is, a walk $j_{0} \rightarrow j_{1} \rightarrow \cdots \rightarrow j_{n}$ such that $j_{i}=j_{i^{\prime}}$ if and only if $i=i^{\prime}$.

Pizer 32 proved that $\Gamma_{1}(\ell ; p)$ is Ramanujan: in particular, $\Gamma_{1}(\ell ; p)$ is a connected expander graph, and its diameter is $O(\log p)$. We therefore expect the end-points of short random walks from any given vertex $j_{0}$ to quickly yield a uniform distribution on $S_{1}(p)$. Indeed, if $j_{0}$ is fixed and $j_{n}$ is the end-point of an $n$-step random walk from $j_{0}$ in $\Gamma_{1}(\ell ; p)$, then [21, Theorem 1] shows that

$$
\begin{equation*}
\left|\operatorname{Pr}\left[j_{n}=j\right]-\frac{1}{\# S_{1}(p)}\right| \leq\left(\frac{2 \sqrt{\ell}}{\ell+1}\right)^{n} \quad \text { for all } j \in S_{1}(p) \tag{2}
\end{equation*}
$$

The isogeny problem in $\Gamma_{1}(\ell ; p)$ is, given $j_{0}$ and $j$ in $S_{1}(p)$, to find a path (of any length) from $j_{0}$ to $j$ in $\Gamma_{1}(\ell ; p)$. The difficulty of the isogeny problem underpins the security of the Charles-Goren-Lauter hash function (see $\$ 3$ below).

The isogeny problem is supposed to be hard. Our best generic classical pathfinding algorithms look for collisions in random walks, and run in expected time the square root of the graph size: in this case, $\widetilde{O}(\sqrt{p})$. In the special case of supersingular isogeny graphs, we can make some practical improvements but the asymptotic complexity remains the same: given $j_{0}$ and $j$ in $F_{1}(p ; \ell)$, we can compute a path $j_{0} \rightarrow j$ in $\widetilde{O}(\sqrt{p})$ classical operations (see [14).

The best known quantum algorithm for path-finding [3] instead searches for paths from $j_{0} \rightarrow j_{0}^{\prime}$ and from $j \rightarrow j^{\prime}$, where $j_{0}^{\prime}$ and $j^{\prime}$ are both in $\mathbb{F}_{p}$. Of the $O(p)$ elements in $S_{1}(p)$, there are $O(\sqrt{p})$ elements contained in $\mathbb{F}_{p}$; while a classical search for elements this sparse would therefore run in time $O(\sqrt{p})$, Grover's quantum algorithm [24] completes the search in expected time $O(\sqrt[4]{p})$. It remains to find a path from $j_{0}^{\prime}$ to $j^{\prime}$. This could be computed classically in time $\widetilde{O}(\sqrt[4]{p})$ using the Delfs-Galbraith algorithm, but Biasse, Jao and Sankar 3] show that a quantum computer can find paths between subfield curves in subexponential time, yielding an overall algorithm that runs in expected time $O(\sqrt[4]{p})$.

We can also consider the problem of finding paths of a fixed (and typically short) length: for example, given $e>0$ and $j_{0}$ and $j$ in $S_{1}(p)$ such that there exists a path $\phi: j_{0} \rightarrow \cdots \rightarrow j$ of length $e$, find $\phi$. This problem arises in the security analysis of SIDH, for example.

## 3 Cryptosystems in the elliptic supersingular graph

The Charles-Goren-Lauter hash function (CGL). Supersingular isogenies appeared in cryptography with the CGL hash function, which operates in $\Gamma_{1}(2 ; p)$. Fix a base point $j_{0}$ in $S_{1}(p)$, and one of the three edges in $\Gamma_{1}(2 ; p)$ leading into it: $j_{-1} \rightarrow j_{0}$, say. To hash an $n$-bit message $m=\left(m_{0}, m_{1}, \ldots, m_{n-1}\right)$, we let $m$ drive a non-backtracking walk $j_{0} \rightarrow \cdots \rightarrow j_{n}$ on $\Gamma_{1}(2 ; p)$ : for each $0 \leq i<n$, we compute the two roots $\alpha_{0}$ and $\alpha_{1}$ of $\Phi_{2}\left(j_{i}, X\right) /\left(j_{i-1}-X\right)$ to determine the neighbours of $j_{i}$ that are not $j_{i-1}$, numbering the roots with respect to some ordering of $\mathbb{F}_{p^{2}}$ (here $\Phi_{2}(Y, X)$ is the classical modular polynomial), and set $j_{i+1}=\alpha_{m_{i}}$.

Once we have computed the entire walk $j_{0} \rightarrow \cdots \rightarrow j_{n}$, we can derive a $\log _{2} p$-bit hash value $H(m)$ from the end-point $j_{n}$; we call this step finalisation. Charles, Goren, and Lauter suggest applying a linear function $f: \mathbb{F}_{p^{2}} \rightarrow \mathbb{F}_{p}$ to map $j_{n}$ to $H(m)=f\left(j_{n}\right)$. For example, if $\mathbb{F}_{p^{2}}=\mathbb{F}_{p}(\omega)$ then we can map $j_{n}=j_{n, 0}+j_{n, 1} \omega$ (with $j_{n, 0}$ and $j_{n, 1}$ in $\mathbb{F}_{p}$ ) to $H(m)=a j_{n, 0}+b j_{n, 1}$ for some fixed random choice of $a$ and $b$ in $\mathbb{F}_{p}$. Heuristically, for general $f$, if we suppose $S_{1}(p)$ is distributed uniformly in $\mathbb{F}_{p^{2}}$, then roughly one in twelve elements of $\mathbb{F}_{p}$ appear as hash values, and each of those has only one expected preimage in $S_{1}(p)$.

Finding a preimage for a given hash value $h$ in $\mathbb{F}_{p}$ amounts to finding a path $j_{0} \rightarrow \cdots \rightarrow j$ such that $f(j)=h$ : that is, solving the isogeny problem. We note that inverting the finalisation seems hard: for linear $f: \mathbb{F}_{p}^{2} \rightarrow \mathbb{F}_{p}$, we know of no efficient method which given $h$ in $\mathbb{F}_{p}$ computes a supersingular $j$ such that $f(j)=h$. (Brute force search requires $O(p)$ trials.) Finalisation thus gives us some protection against meet-in-the-middle isogeny algorithms. Finding
collisions and second preimages for $H$ amounts to finding cycles in $\Gamma_{1}(2 ; p)$. For well-chosen $p$ and $j_{0}$, this is roughly as hard as the isogeny problem [10, §5].

SIDH. Jao and De Feo's SIDH key exchange 27] begins with a supersingular curve $\mathcal{E}_{0} / \mathbb{F}_{p^{2}}$, where $p$ is in the form $c \cdot 2^{a} 3^{b}-1$, with fixed torsion bases $\left\langle P_{2}, Q_{2}\right\rangle=$ $\mathcal{E}_{0}\left[2^{a}\right]$ and $\left\langle P_{3}, Q_{3}\right\rangle=\mathcal{E}_{0}\left[3^{b}\right]$ (which are rational because of the special form of $p)$. Alice computes a secret walk $\phi_{A}: \mathcal{E}_{0} \rightarrow \cdots \rightarrow \mathcal{E}_{A}$ of length $a$ in $\Gamma_{1}(2 ; p)$, publishing $\mathcal{E}_{A}, \phi_{A}\left(P_{3}\right)$, and $\phi_{A}\left(Q_{3}\right)$; similarly, Bob computes a secret walk $\phi_{B}$ : $\mathcal{E}_{0} \rightarrow \cdots \rightarrow \mathcal{E}_{B}$ of length $b$ in $\Gamma_{1}(3 ; p)$, publishing $\mathcal{E}_{B}, \phi_{B}\left(P_{2}\right)$, and $\phi_{B}\left(Q_{2}\right)$. The basis images allow Alice to compute $\phi_{B}\left(\operatorname{ker} \phi_{A}\right)$, and $\operatorname{Bob} \phi_{A}\left(\operatorname{ker} \phi_{B}\right)$; Alice can thus "repeat" her walk starting from $\mathcal{E}_{B}$, and Bob his walk from $\mathcal{E}_{A}$, to arrive at curves representing the same point in $S_{1}(p)$, which is their shared secret.

Breaking Alice's public key amounts to solving an isogeny problem in $\Gamma_{1}(2 ; p)$ subject to the constraint that the walk have length $a$ (which is particularly short). The $3^{b}$-torsion basis may give some useful information here, though so far this is only exploited in attacks on artificial variants of SIDH 31. Similarly, breaking Bob's public key amounts to solving a length- $b$ isogeny problem in $\Gamma_{1}(3 ; p)$. Alternatively, we can compute these short paths by computing endomorphism rings: [20, Theorem 4.1] states that if $\mathcal{E}$ and $\mathcal{E}^{\prime}$ are in $S_{1}(p)$ and we have explicit descriptions of $\operatorname{End}(\mathcal{E})$ and $\operatorname{End}\left(\mathcal{E}^{\prime}\right)$, then we can efficiently compute the shortest path from $\mathcal{E}$ to $\mathcal{E}^{\prime}$ in $\Gamma_{1}(\ell ; p)$ (see [29|2017] for further details on this approach).

## 4 Abelian varieties and polarizations

An abelian variety is a smooth projective algebraic group variety. An isogeny of abelian varieties is a surjective finite morphism $\phi: \mathcal{A} \rightarrow \mathcal{A}^{\prime}$ such that $\phi\left(0_{\mathcal{A}}\right)=$ $0_{\mathcal{A}^{\prime}}$. In dimension $g=1$, these definitions coincide with those for elliptic curves.

The proper higher-dimensional generalization of an elliptic curve is a principally polarized abelian variety (PPAV). A polarization of $\mathcal{A}$ is an isogeny $\lambda: \mathcal{A} \rightarrow \widehat{\mathcal{A}}$, where $\widehat{\mathcal{A}} \cong \operatorname{Pic}^{0}(\mathcal{A})$ is the dual abelian variety; $\lambda$ is principal if it is an isomorphism. If $\mathcal{A}=\mathcal{E}$ is an elliptic curve, then there is a canonical principal polarization $\lambda: P \mapsto[(P)-(\infty)]$, and every other principal polarization is isomorphic to $\lambda$ (via composition with a suitable translation and automorphism). The Jacobian $\mathcal{J}_{\mathcal{C}}$ of a curve $\mathcal{C}$ also has a canonical principal polarization defined by the theta divisor, which essentially corresponds to an embedding of $\mathcal{C}$ in $\mathcal{J}_{\mathcal{C}}$, and thus connects $\mathcal{J}_{\mathcal{C}}$ with the divisor class group of $\mathcal{C}$.

We need a notion of compatibility between isogenies and principal polarizations. First, recall that every isogeny $\phi: \mathcal{A} \rightarrow \mathcal{A}^{\prime}$ has a dual isogeny $\widehat{\phi}: \widehat{\mathcal{A}^{\prime}} \rightarrow \widehat{\mathcal{A}}$. Now, if $(\mathcal{A}, \lambda)$ and $\left(\mathcal{A}^{\prime}, \lambda^{\prime}\right)$ are PPAVs, then $\phi: \mathcal{A} \rightarrow \mathcal{A}^{\prime}$ is an isogeny of PPAVs if $\widehat{\phi} \circ \lambda^{\prime} \circ \phi=[d] \lambda$ for some integer $d$. We then have $\phi^{\dagger} \circ \phi=[d]$ on $\mathcal{A}$ (and $\phi \circ \phi^{\dagger}=[d]$ on $\mathcal{A}^{\prime}$ ), where $\phi^{\dagger}:=\lambda^{-1} \circ \widehat{\phi} \circ \lambda^{\prime}$ is the Rosati dual. Intuitively, $\phi$ will be defined by homogeneous polynomials of degree $d$ with respect to projective coordinate systems on $\mathcal{A}$ and $\mathcal{A}^{\prime}$ corresponding to $\lambda$ and $\lambda^{\prime}$, respectively. There
is a simple criterion on subgroups $S \subset \mathcal{A}[d]$ to determine when an isogeny with kernel $S$ is an isogeny of PPAVs: the subgroup should be Lagrangian 4

Definition 2. Let $\mathcal{A} / \overline{\mathbb{F}}_{p}$ be a PPAV and let $m$ be an integer prime to $p$. A Lagrangian subgroup of $\mathcal{A}[m]$ is a maximal $m$-Weil isotropic subgroup of $\mathcal{A}[m]$.

If $\ell \neq p$ is prime, then $\mathcal{A}\left[\ell^{n}\right] \cong\left(\mathbb{Z} / \ell^{n} \mathbb{Z}\right)^{2 g}$ for all $n>0$. If $S \subset \mathcal{A}[\ell]$ is Lagrangian, then $S \cong(\mathbb{Z} / \ell \mathbb{Z})^{g}$. Any Lagrangian subgroup of $A\left[\ell^{n}\right]$ is isomorphic to $(\mathbb{Z} / \ell \mathbb{Z})^{n_{1}} \times \cdots \times(\mathbb{Z} / \ell \mathbb{Z})^{n_{g}}$ for some $n_{1} \geq \cdots \geq n_{g}$ with $\sum_{i} n_{i}=g n$ (though not every $\left(n_{1}, \ldots, n_{g}\right)$ with $\sum_{i} n_{i}=g n$ occurs in this way).

We now have almost everything we need to generalize supersingular isogeny graphs from elliptic curves to higher dimension. The elliptic curves will be replaced by PPAVs; $\ell$-isogenies will be replaced by isogenies with Lagrangian kernels in the $\ell$-torsion-called $(\ell, \ldots, \ell)$-isogenies - and the elliptic dual isogeny will be replaced by the Rosati dual. It remains to define the right analogue of supersingularity in higher dimension, and study the resulting graphs.

## 5 The superspecial isogeny graph in dimension $g$

We need an appropriate generalization of elliptic supersingularity to $g>1$. As explained in [7], it does not suffice to simply take the PPAVs $\mathcal{A} / \overline{\mathbb{F}}_{p}$ with $\mathcal{A}[p]=0$.

Definition 3. $A P P A V \mathcal{A}$ is supersingular if the Newton polygon of its Frobenius endomorphism has all slopes equal to $1 / 2$, and superspecial if Frobenius acts as 0 on $H^{1}\left(\mathcal{A}, \mathcal{O}_{\mathcal{A}}\right)$. Superspecial implies supersingular; in dimension $g=1$, the definitions coincide.

All supersingular PPAVs are isogenous to a product of supersingular elliptic curves. Superspecial abelian varieties are isomorphic to a product of supersingular elliptic curves, though generally only as unpolarized abelian varieties. The special case of Jacobians is particularly relevant for us when constructing examples: $\mathcal{J}_{\mathcal{C}}$ is superspecial if and only if the Hasse-Witt matrix of $\mathcal{C}$ vanishes.

It is argued in 7 that the world of superspecial (and not supersingular) PPAVs is the correct setting for supersingular isogeny-based cryptography. We will not repeat this argument here; but in any case, every higher-dimensional "supersingular" cryptosystem proposed so far has in fact been superspecial.

In analogy with the elliptic supersingular graph, then, we define

$$
S_{g}(p):=\left\{\mathcal{A}: \mathcal{A} / \mathbb{F}_{p^{2}} \text { is a superspecial } g \text {-dimensional PPAV }\right\} / \cong
$$

Our first task is to estimate the size of $S_{g}(p)$.
Lemma 1. We have $\# S_{g}(p)=O\left(p^{g(g+1) / 2}\right)$.

[^1]Proof. See [18, §5]. This follows from the Hashimoto-Ibukiyama mass formula

$$
\sum_{A \in S_{g}(p)} \frac{1}{\# \operatorname{Aut}(A)}=\prod_{i=1}^{g} \frac{B_{2 i}}{4 i}\left(1+(-p)^{i}\right)
$$

where $B_{2 i}$ is the $2 i$-th Bernoulli number. In particular, $\# S_{g}(p)$ is a polynomial in $p$ of degree $\sum_{i=1}^{g} i=g(g+1) / 2$.

Note that $\# S_{g}(p)$ grows quadratically in $g$ (and exponentially in $\log p$ ): we have $\# S_{1}(p)=O(p), \# S_{2}(p)=O\left(p^{3}\right), \# S_{3}(p)=O\left(p^{6}\right)$, and $\# S_{4}(p)=O\left(p^{10}\right)$.

For each prime $\ell \neq p$, we let $\Gamma_{g}(\ell ; p)$ denote the (directed) graph on $S_{g}(p)$ whose edges are $\overline{\mathbb{F}}_{p}$-isomorphism classes of $(\ell, \cdots, \ell)$-isogenies of PPAVs: that is, isogenies whose kernels are Lagrangian subgroups of the $\ell$-torsion. Superspeciality is invariant under $(\ell, \ldots, \ell)$-isogeny, so to determine the degree of the vertices of $\Gamma_{g}(\ell ; p)$ it suffices to enumerate the Lagrangian subgroups of a $g$-dimensional PPAV. A simple counting argument yields Lemma 2,

Lemma 2. If $\mathcal{A} / \overline{\mathbb{F}}_{p}$ is a $g$-dimensional $P P A V$, then the number of Lagrangian subgroups of $\mathcal{A}[\ell]$, and hence the number of edges leaving $\mathcal{A}$ in $\Gamma_{g}(\ell ; p)$, is

$$
N_{g}(\ell):=\sum_{d=0}^{g}\left[\begin{array}{l}
g \\
d
\end{array}\right]_{\ell} \cdot \ell^{\left(\frac{g-d+1}{2}\right)} .
$$

(The $\ell$-binomial coefficient $\left[\begin{array}{l}n \\ k\end{array}\right]_{\ell}:=\frac{(n)_{\ell} \cdots(n-k+1)_{\ell}}{(k)_{\ell} \cdots(1)_{\ell}}$, where $(i)_{\ell}:=\frac{\ell^{i}-1}{\ell-1}$, counts the $k$-dimensional subspaces of $\mathbb{F}_{\ell}^{n}$.) In particular, $\Gamma_{g}(\ell ; p)$ is $N_{g}(\ell)$-regular; and $N_{g}(\ell)$ is a polynomial in $\ell$ of degree $g(g+1) / 2$.

We do not yet have analogues of Pizer's theorem to guarantee that $\Gamma_{g}(\ell ; p)$ is Ramanujan when $g>1$, though this is proven for superspecial abelian varieties with real multiplication [26]. We therefore work on the following hypothesis:

Hypothesis 1. The graph $\Gamma_{g}(\ell ; p)$ is Ramanujan.
We need Hypothesis 1 in order to obtain the following analogue of Eq. 2 (a standard random walk theorem, as in [25, §3]): if we fix a vertex $\mathcal{A}_{0}$ and consider $n$-step random walks $\mathcal{A}_{0} \rightarrow \cdots \rightarrow \mathcal{A}_{n}$, then

$$
\begin{equation*}
\left|\operatorname{Pr}\left[\mathcal{A}_{n} \cong \mathcal{A}\right]-\frac{1}{\# S_{g}(p)}\right| \leq\left(\frac{2 \sqrt{N_{g}(\ell)-1}}{N_{g}(\ell)}\right)^{n} \quad \text { for all } \mathcal{A} \in S_{g}(p) \tag{3}
\end{equation*}
$$

That is, random walks in $\Gamma_{g}(\ell ; p)$ converge exponentially quickly to the uniform distribution: after $O(\log p)$ steps in $\Gamma_{g}(\ell ; p)$ we are uniformly distributed over $S_{g}(p)$. Given specific $\ell$ and $g$, we can explicitly derive the constant hidden by the big- $O$ to bound the minimum $n$ yielding a distribution within $1 / \# S_{g}(p)$ of uniform.

Remark 1. Existing proposals of higher-dimensional supersingular isogeny-based cryptosystems all implicitly assume (special cases of) Hypothesis 1 For the purposes of attacking their underlying hard problems, we are comfortable making the same hypothesis. After all, if our algorithms are less effective because the expansion properties of $\Gamma_{g}(\ell ; p)$ are less than ideal, then the cryptosystems built on $\Gamma_{g}(\ell ; p)$ will fail to be effective by the same measure.

## 6 Superspecial cryptosystems in dimension $g=2$

Before attacking the isogeny problem in $\Gamma_{g}(\ell ; p)$, we consider some of the cryptosystems that have recently been defined in $\Gamma_{2}(\ell ; p)$. This will also illustrate some methods for computing in these graphs, and as well as special cases of the general phenomena that can help us solve the isogeny problem more efficiently. For the rest of this section, therefore, we restrict to dimension $g=2$.

Every 2-dimensional PPAV is isomorphic (as a PPAV) to either the Jacobian of a genus-2 curve, or to a product of two elliptic curves. We can therefore split $S_{2}(p)$ naturally into two disjoint subsets: $S_{2}(p)=S_{2}(p)^{J} \sqcup S_{2}(p)^{E}$, where

$$
\begin{aligned}
& S_{2}(p)^{J}:=\left\{\mathcal{A} \in S_{2}(p): \mathcal{A} \cong \mathcal{J}_{\mathcal{C}} \text { with } g(\mathcal{C})=2\right\} \quad \text { and } \\
& S_{2}(p)^{E}:=\left\{\mathcal{A} \in S_{2}(p): \mathcal{A} \cong \mathcal{E}_{1} \times \mathcal{E}_{2} \text { with } \mathcal{E}_{1}, \mathcal{E}_{2} \in S_{1}(p)\right\}
\end{aligned}
$$

Vertices in $S_{2}(p)^{J}$ are "general", while vertices in $S_{2}(p)^{E}$ are "special". We can make the estimates implied by Lemma 1 more precise: if $p>5$, then

$$
\# S_{2}(p)^{J}=\frac{1}{2880} p^{3}+\frac{1}{120} p^{2} \quad \text { and } \quad \# S_{2}(p)^{E}=\frac{1}{288} p^{2}+O(p)
$$

(see e.g. [7, Proposition 2]). In particular, $\# S_{2}(p)^{E} / \# S_{2}(p)=10 / p+o(1)$.

Takashima's hash function. Takashima [36] was the first to generalize CGL to $g=2$. We start with a distinguished vertex $\mathcal{A}_{0}$ in $S_{2}(p)$, and a distinguished incoming edge $\mathcal{A}_{-1} \rightarrow \mathcal{A}_{0}$ in $\Gamma_{2}(\ell ; p)$. Each message $m$ then drives a walk in $\Gamma_{2}(\ell ; p)$ : at each vertex we have a choice of 14 forward isogenies (the 15 th is the dual of the previous, which is a prohibited backtracking step). The message $m$ is therefore coded in base 14. While traversing the graph, the vertices are handled as concrete genus-2 curves representing the isomorphism classes of their Jacobians. Lagrangian subgroups correspond to factorizations of the hyperelliptic polynomials into a set of three quadratics, and the isogenies are computed using Richelot's formulæ (see [6, Chapters 9-10] and [33, Chapter 8]). We derive a hash value From the final vertex $\mathcal{A}_{n}$ as the Igusa-Clebsch invariants of the Jacobian, in $\mathbb{F}_{p^{2}}^{3}$; Takashima does not define a finalisation map (into $\mathbb{F}_{p}^{3}$, for example).

Flynn and Ti observe in [19] that this hash function has a fatal weakness: it is trivial to compute length- 4 cycles starting from any vertex in $\Gamma_{2}(2 ; p)$, as in Example [1. Every cycle produces infinitely many hash collisions.

Example 1. Given some $\mathcal{A}_{0}$ in $S_{2}(p)$, choose a point $P$ of order 4 on $\mathcal{A}_{0}$. There exist $Q$ and $R$ in $\mathcal{A}_{0}[2]$ such that $e_{2}([2] P, Q)=1$ and $e_{2}([2] P, R)=1$, but $e_{2}(Q, R) \neq 1$. The Lagrangian subgroups $K_{0}:=\langle[2] P, Q\rangle$ and $K_{0}^{\prime}:=\langle[2] P, R\rangle$ of $\mathcal{A}_{0}[2]$ are kernels of (2,2)-isogenies $\phi_{0}: \mathcal{A}_{0} \rightarrow \mathcal{A}_{1} \cong \mathcal{A}_{0} / K_{0}$ and $\phi_{0}^{\prime}: \mathcal{A}_{0} \rightarrow$ $\mathcal{A}_{1}^{\prime} \cong \mathcal{A}_{0} / K_{0}^{\prime}$; and in general, $\mathcal{A}_{1} \not \approx \mathcal{A}_{1}^{\prime}$. Now $K_{1}:=\phi_{0}\left(K_{0}^{\prime}\right)$ and $K_{1}^{\prime}:=\phi_{0}^{\prime}\left(K_{0}\right)$ are Lagrangian subgroups of $\mathcal{A}_{1}[2]$. Writing $I_{1}=\operatorname{ker} \phi_{1}{ }^{\dagger}$ and $I_{1}^{\prime}=\operatorname{ker}\left(\phi_{1}^{\prime}\right)^{\dagger}$, we see that $K_{1} \cap I_{1}=\left\langle\phi_{1}(R)\right\rangle$ and $K_{1}^{\prime} \cap I_{1}^{\prime}=\left\langle\phi_{1}(Q)\right\rangle$. We thus define another pair of (2,2)-isogenies, $\phi_{1}: \mathcal{A}_{1} \rightarrow \mathcal{A}_{2} \cong \mathcal{A}_{1} / K_{1}$ and $\phi_{1}^{\prime}: \mathcal{A}_{1}^{\prime} \rightarrow \mathcal{A}_{2}^{\prime} \cong \mathcal{A}_{1}^{\prime} / K_{1}^{\prime}$. We have $\operatorname{ker}\left(\phi_{1} \circ \phi_{0}\right)=\operatorname{ker}\left(\phi_{1}^{\prime} \circ \phi_{0}^{\prime}\right)$, so $\mathcal{A}_{2} \cong \mathcal{A}_{2}^{\prime}$. Now let $\psi:=\left(\phi_{0}^{\prime}\right)^{\dagger} \circ\left(\phi_{1}^{\prime}\right)^{\dagger} \circ \phi_{1} \circ \phi_{0}$. We have $\psi \cong[4]_{\mathcal{A}_{0}}$, but $\psi$ does not factor over $[2]_{\mathcal{A}_{0}}$ (since $\mathcal{A}_{1} \neq \mathcal{A}_{1}^{\prime}$ ). Hence $\psi$ represents a nontrivial cycle of length 4 in the graph.

The ubiquity of these length- 4 cycles does not mean that $\Gamma_{2}(2 ; p)$ is no use for hashing: it just means that we must use a stronger rule than backtrack-avoidance when selecting steps in a walk. The following hash function does just this.

The Castryck-Decru-Smith hash function ( $C D S$ ). Another generalization of CGL from $\Gamma_{1}(2 ; p)$ to $\Gamma_{2}(2 ; p)$, neatly avoiding the length- 4 cycles of Example 1 , is defined in [7]. Again, we fix a vertex $\mathcal{A}_{0}$ and an isogeny $\phi_{-1}: \mathcal{A}_{-1} \rightarrow \mathcal{A}_{0}$; we let $I_{0} \subset \mathcal{A}_{0}[2]$ be the kernel of the Rosati dual $\phi_{-1}^{\dagger}$. Now, let $m=\left(m_{0}, \ldots, m_{n-1}\right)$ be a $3 n$-bit message, with each $0 \leq m_{i}<8$. The sequence ( $m_{0}, \ldots, m_{n-1}$ ) drives a path through $\Gamma_{2}(2 ; p)$ as follows: our starting point is $\mathcal{A}_{0}$, with its distinguished subgroup $I_{0}$ corresponding to the edge $\mathcal{A}_{-1} \rightarrow \mathcal{A}_{0}$. For each $0 \leq i<n$, we compute the set of eight Lagrangian subgroups $\left\{S_{i, 0}, \ldots, S_{i, 7}\right\}$ of $\mathcal{A}_{i}[2]$ such that $S_{i, j} \cap I_{i}=0$, numbering them according to some fixed ordering on the encodings of Lagrangian subgroups. Then we compute $\phi_{i}: \mathcal{A}_{i} \rightarrow \mathcal{A}_{i+1} \cong \mathcal{A}_{i} / S_{i, m_{i}}$, and let $I_{i+1}:=\phi_{i}\left(\mathcal{A}_{i}[2]\right)=\operatorname{ker} \phi_{i}{ }^{\dagger}$. Once we have computed the entire walk $\mathcal{A}_{0} \rightarrow \cdots \rightarrow \mathcal{A}_{n}$, we can derive a $3 \log _{2} p$-bit hash value $H(m)$ from the isomorphism class of $\mathcal{A}_{n}$ (though such a finalisation is unspecified in [7). The subgroup intersection condition ensures that the composition of the isogenies in the walk is a $\left(2^{n}, \ldots, 2^{n}\right)$-isogeny, thus protecting us from the small cycles of Example 1 .

Putting this into practice reveals an ugly technicality. As in Takashima's hash function, we compute with vertices as genus-2 curves, encoded by their hyperelliptic polynomials, with (2,2)-isogenies computed using Richelot's formulæ. Walk endpoints are mapped to Igusa-Clebsch invariants in $\mathbb{F}_{p^{2}}^{3}$. But these curves, formulæ, and invariants only exist for vertices in $S_{2}(p)^{J}$. We can handle vertices in $S_{2}(p)^{E}$ as pairs of elliptic curves, with pairs of $j$-invariants for endpoints, and there are explicit formulæ to compute isogenies in to and out of $S_{2}(p)^{E}$ (see e.g. [7, §3]). Switching between representations and algorithms (to say nothing of finalisation, where $S_{2}(p)^{E}$ would have a smaller, easily distinguishable, and easier-to-invert image) seems like needless fiddle when the probability of stepping onto a vertex in $S_{2}(p)^{E}$ is only $O(1 / p)$, which is negligible for cryptographic $p$.

In 7, this issue was swept under the rug by defining simpler algorithms which efficiently walk in the subgraph of $\Gamma_{2}(2 ; p)$ supported on $S_{2}(p)^{J}$, and simply fail if they walk into $S_{2}(p)^{E}$. This happens with probability $O(1 / p)$, which may seem acceptable - however, this also means that it is exponentially easier to find $a$
message where the hash fails than it is to find a preimage with a square-root algorithm. The former requires $O(p)$ work, the latter $O\left(p^{3 / 2}\right)$. In this, as we will see, the simplified CDS hash function contains the seeds of its own destruction.

Genus-2 SIDH. Flynn and Ti 19 defined an SIDH analogue in dimension $g=2$. As in the hash functions above, Richelot isogenies are used for Alice's steps in $\Gamma_{2}(2 ; p)$, while explicit formulæ for ( 3,3 )-isogenies on Kummer surfaces are used for Bob's steps in $\Gamma_{2}(3 ; p)$. Walks may (improbably) run into $S_{2}(p)^{E}$, as with the hash functions above; but the same work-arounds apply without affecting security. (Further, if we generate a public key in $S_{2}(p)^{E}$, then we can discard it and generate a new one in $S_{2}(p)^{J}$.) As with SIDH, breaking public keys amounts to computing short solutions to the isogeny problem in $\Gamma_{2}(2 ; p)$ or $\Gamma_{2}(3 ; p)$, though presumably endomorphism attacks generalizing [17] also exist.

## 7 Attacking the isogeny problem in superspecial graphs

We want to solve the isogeny problem in $\Gamma_{g}(\ell ; p)$. We can always do this using random walks in $O\left(\sqrt{\# S_{g}(p)}\right)=O\left(p^{g(g+1) / 4}\right)$ classical steps.

Our idea is that $S_{g-1}(p) \times S_{1}(p)$ maps into $S_{g}(p)$ by mapping a pair of PPAVs to their product equipped with the product polarization, and the image of $S_{g-1}(p) \times S_{1}(p)$ represents a large set of easily-identifiable "distinguished vertices" in $\Gamma_{g}(\ell ; p)$. Indeed, since the map $S_{g-1}(p) \times S_{1}(p) \rightarrow S_{g}(p)$ is generically finite, of degree independent of $p$, Lemma 1 implies that

$$
\begin{equation*}
\# S_{g}(p) / \#\left(\text { image of } S_{g-1}(p) \times S_{1}(p)\right)=O\left(p^{g-1}\right) \quad \text { for } g>1 \tag{4}
\end{equation*}
$$

We can efficiently detect such a step into a product PPAV in a manner analogous to that of the failure of the CDS hash function: for example, by the breakdown of a higher-dimensional analogue of Richelot's formulæ such as 30.

We can walk into this subset, then recursively solve the path-finding problem in the subgraphs $\Gamma_{g-1}(\ell ; p), \ldots, \Gamma_{1}(\ell ; p)$ (each time walking from $\Gamma_{i}(\ell ; p)$ into $\left.\Gamma_{i-1}(\ell ; p) \times \Gamma_{1}(\ell ; p)\right)$ before gluing the results together to obtain a path in $\Gamma_{g}(\ell ; p)$.

Lemma 3. Let $\alpha: A \rightarrow A^{\prime}$ and $\beta: B \rightarrow B^{\prime}$ be walks in $\Gamma_{i}(\ell ; p)$ and $\Gamma_{j}(\ell ; p)$ of lengths $a$ and $b$, respectively. If $a \equiv b(\bmod 2)$, then we can efficiently compute a path of length $\max (a, b)$ from $A \times B$ to $A^{\prime} \times B^{\prime}$ in $\Gamma_{i+j}(\ell ; p)$.

Proof. Write $\alpha=\alpha_{1} \circ \cdots \circ \alpha_{a}$ and $\beta=\beta_{1} \circ \cdots \circ \beta_{b}$ as compositions of $(\ell, \cdots, \ell)$ isogenies. WLOG, suppose $a \geq b$. Set $\beta_{b+1}=\beta_{b}^{\dagger}, \beta_{b+2}=\beta_{b}, \ldots, \beta_{a-1}=\beta_{b}^{\dagger}$, $\beta_{a}=\beta_{b}$; then $\alpha \times \beta:\left(\alpha_{1} \times \beta_{1}\right) \circ \cdots \circ\left(\alpha_{a} \times \beta_{a}\right)$ is a path from $A \times B$ to $A^{\prime} \times B^{\prime}$.

Equations 3 and 4 show that a walk of length $O(\log p)$ lands in the image of $S_{g-1}(p) \times S_{1}(p)$ with probability $O\left(1 / p^{g-1}\right)$, and after $O\left(p^{g-1}\right)$ such short walks we are in $S_{g-1}(p) \times S_{1}(p)$ with probability bounded away from zero. More generally, we can walk into the image of $S_{g-i}(p) \times S_{i}(p)$ for any $0<i<g$; but the probability of this is $O\left(1 / p^{i(g-i)}\right)$, which is maximised by $i=1$ and $g-1$.

```
Algorithm 1: Computing isogeny paths in \(\Gamma_{g}(\ell ; p)\)
    Input: \(\mathcal{A}\) and \(\mathcal{A}^{\prime}\) in \(S_{g}(p)\)
    Output: A path \(\phi: \mathcal{A} \rightarrow \mathcal{A}^{\prime}\) in \(\Gamma_{g}(\ell ; p)\)
    Find a path \(\psi\) from \(\mathcal{A}\) to some point \(\mathcal{B} \times \mathcal{E}\) in \(S_{g-1}(p) \times S_{1}(p)\)
    Find a path \(\psi^{\prime}\) from \(\mathcal{A}^{\prime}\) to some point \(\mathcal{B}^{\prime} \times \mathcal{E}^{\prime}\) in \(S_{g-1}(p) \times S_{1}(p)\)
    Find a path \(\beta: \mathcal{B} \rightarrow \mathcal{B}^{\prime}\) in \(\Gamma_{g-1}(\ell ; p)\) using Algorithm recursively if \(g-1>1\),
        or elliptic path-finding if \(g-1=1\)
    Find a path \(\eta: \mathcal{E} \rightarrow \mathcal{E}^{\prime}\) in \(\Gamma_{1}(\ell ; p)\) using elliptic path-finding
    Let \(b=\operatorname{length}(\beta)\) and \(e=\operatorname{length}(\eta)\). If \(b \not \equiv e(\bmod 2)\), then fail and return \(\perp\)
        (or try again with another \(\psi\) and/or \(\psi^{\prime}, \beta\), or \(\eta\) )
    Construct the product path \(\pi: \mathcal{B} \times \mathcal{E} \rightarrow \mathcal{B}^{\prime} \times \mathcal{E}^{\prime}\) defined by Lemma 3
    return the path \(\phi:=\psi^{\prime \dagger} \circ \pi \circ \psi\) from \(\mathcal{A}\) to \(\mathcal{A}^{\prime}\).
```

Proof of Theorem 1 Algorithm 1 implements the approach above, and proves Theorem [1. Step 1 computes $\psi$ by taking $O\left(p^{g-1}\right)$ non-backtracking random walks of length $O(\log (p))$ which can be trivially parallelized, so with $P$ processors we expect $\widetilde{O}\left(p^{g-1} / P\right)$ steps before finding $\psi$. (If $\mathcal{A}$ is a fixed public base point then we can assume $\psi$ is already known). Likewise, Step 2 takes $\widetilde{O}\left(p^{g-1} / P\right)$ steps to compute $\psi^{\prime}$. After $g-1$ recursive calls, we have reduced to the problem of computing paths in $\Gamma_{1}(\ell ; p)$ in Step 4, which can be done in time $O(\sqrt{p} / P)$. Step 7 applies Lemma 3 to compute the final path in polynomial time. At each level of the recursion, we have a $1 / 2$ chance of having the same walk-length parity; hence, Algorithm 1 succeeds with probability $1 / 2^{g-1}$. This could be improved by computing more walks when the parities do not match, but $1 / 2^{g-1}$ suffices to prove the theorem. The total runtime is $\widetilde{O}\left(p^{g-1} / P\right)$ isogeny steps.

Proof of Theorem 2 Algorithm 1 can be run in a quantum computation model as follows. First, recall from the proof of Theorem 1 that Steps 1 and 2 find product varieties by taking $O\left(p^{g-1}\right)$ walks of length $O(\log (p))$. Here we proceed following Biasse, Jao and Sankar [3, §4]. Let $N$ be the number of walks in $O\left(p^{g-1}\right)$ of length $\lambda($ in $O(\log (p)))$. To compute $\psi$, we define an injection

$$
f:[1, \ldots, N] \longrightarrow\{\text { nodes of distance } \lambda \text { starting from } \mathcal{A}\}
$$

and a function $C_{f}:[1, \ldots, N] \rightarrow\{0,1\}$ by $C_{f}(x)=1$ if $f(x)$ is in $S_{g-1}(p) \times$ $S_{1}(p)$, and 0 otherwise. If there is precisely one $x$ with $C_{f}(x)=1$, Grover's algorithm 24 will find it (with probability $\geq 1 / 2)$ in $O(\sqrt{N})$ iterations. If there are an unknown $t \geq 1$ such solutions, then Boyer-Brassard-Høyer-Tapp [5] finds one in $O(\sqrt{N / t})$ iterations. Hence, if we take $\lambda$ large enough to expect at least one solution, then we will find it in $O\left(\sqrt{p^{g-1}}\right)$ Grover iterations. We compute $\psi^{\prime}$ (and any recursive invocations of Steps 1 and 2) similarly.

For the elliptic path finding in Steps 3 and 4 we can apply (classical) Pollardstyle pseudorandom walks which require $\widetilde{O}(\sqrt{p})$ memory and $\widetilde{O}(\sqrt{p})$ operations to find an $\ell$-isogeny path. Alternatively, we can reduce storage costs by applying

Grover's algorithm to the full graph $\Gamma_{1}(\ell ; p)$ to find an $\ell$-isogeny path in expected time $O(\sqrt{p})$. Finally, Step 7 applies Lemma 3 to compute the final path.
Remark 2. We can use the same approach as Algorithm 1 to compute explicit endomorphism rings of superspecial PPAVs. Suppose we want to compute $\operatorname{End}(\mathcal{A})$ for some $g$-dimensional $\mathcal{A}$ in $S_{g}(p)$. Following the first steps of Algorithm [1, we compute a walk $\phi$ from $\mathcal{A}$ into $S_{g-1}(p) \times S_{1}(p)$, classically or quantumly, recursing until we end up at some $\mathcal{E}_{1} \times \cdots \times \mathcal{E}_{g}$ in $S_{1}(p)^{g}$. Now we apply an elliptic endomorphism-ring-computing algorithm to each of the $\mathcal{E}_{i}$; this is equivalent to solving the isogeny problem in $\Gamma_{1}(\ell ; p)$ (see [17, $\left.\left.\S 5\right]\right)$, so its cost is in $\widetilde{O}(\sqrt{p})$. The products of the generators for the $\operatorname{End}\left(\mathcal{E}_{i}\right)$ form generators for $\operatorname{End}\left(\mathcal{E}_{1} \times \cdots \times \mathcal{E}_{g}\right)$, which we can then pull back through $\phi$ to compute a finite-index subring of $\operatorname{End}(\mathcal{A})$ that is maximal away from $\ell$. The total cost is a classical $\widetilde{O}\left(p^{g-1} / P\right)$ (on $P$ processors), or a quantum $\widetilde{O}\left(\sqrt{p^{g-1}}\right)$, plus the cost of the pullback.
Remark 3. Algorithm 1 computes compositions of $(\ell, \ldots, \ell)$-isogenies. If we relax and allow arbitrary-degree isogenies, not just paths in $\Gamma_{g}(\ell ; p)$ for fixed $\ell$, then the elliptic path-finding steps can use the classical Delfs-Galbraith [14 or quantum Biasse-Jao-Sankar [3] algorithms. While this would not change the asymptotic runtime of Algorithm (under the reasonable assumption that the appropriate analogue of vertices "defined over $\mathbb{F}_{p}$ " with commutative endomorphism rings form a subset of size $O\left(\sqrt{\# S_{g}(p)}\right)$ ), both of these algorithms have low memory requirements and are arguably more implementation-friendly than Pollard-style pseudorandom walks [14, §4].

## 8 Cryptographic implications

Table $\mathbb{1}$ compares Algorithm $\mathbb{1}$ with the best known attacks for dimensions $g \leq 6$. For general path-finding, the best known algorithms are classical Pollard-style pseudorandom walks and quantum Grover search [2415]. As noted in Remark 3. higher-dimensional analogues of Delfs-Galbraith [14] or Biasse-Jao-Sankar 3] might yield practical improvements, without changing the asymptotic runtime.

Table 1. Logarithms (base $p$ ) of asymptotic complexities of algorithms for solving the isogeny problems in $\Gamma_{g}(\ell ; p)$ for $1 \leq g \leq 6$. Further explanation in text.

|  | Dimension $g$ | 1 | 2 | 3 | 4 | 5 | 6 |
| :--- | ---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Classical | Algorithm [1] | - | $\mathbf{1}$ | $\mathbf{2}$ | $\mathbf{3}$ | $\mathbf{4}$ | $\mathbf{5}$ |
|  | Pollard/Delfs-Galbraith [14] | 0.5 | 1.5 | 3 | 5 | 7.5 | 10.5 |
| Quantum | Algorithm [1 | - | $\mathbf{0 . 5}$ | $\mathbf{1}$ | $\mathbf{1 . 5}$ | $\mathbf{2}$ | $\mathbf{2 . 5}$ |
|  | Grover/Biasse-Jao-Sankar [3] | 0.25 | 0.75 | 1.5 | 2.5 | 3.75 | 4.25 |

The paths in $\Gamma_{g}(\ell ; p)$ constructed by Algorithm 1 are generally too long to be private keys for SIDH analogues, which are paths of a fixed and typically shorter
length. Extrapolating from $g=1$ [27] and $g=2$ [19], we suppose that the secret keyspace has size $O\left(\sqrt{\# S_{g}(p)}\right)=O\left(p^{g(g+1) / 4}\right)$ and the target isogeny has degree in $O(\sqrt{p})$, corresponding to a path of length roughly $\log _{\ell}(p) / 2$ in $\Gamma_{g}(\ell ; p)$. On the surface, therefore, Algorithm 1 does not yield a direct attack on SIDH-style protocols; or, at least, not a direct attack that succeeds with high probability. (Indeed, to resist direct attacks from Algorithm 1 it would suffice to abort any key generations passing through vertices in $S_{g-1}(p) \times S_{1}(p)$.)

However, we can anticipate an attack via endomorphism rings, generalizing the attack described at the end of 93 , using the algorithm outlined in Remark 2, If we assume that what is polynomial-time for elliptic endomorphisms remains so for (fixed) $g>1$, then we can break $g$-dimensional SIDH keys by computing shortest paths in $\Gamma_{g}(\ell ; p)$ with the same complexity as Algorithm $\mathbb{1}$ that is, classical $\widetilde{O}\left(p^{g-1} / P\right)$ and quantum $\widetilde{O}\left(p^{(g-1) / 2}\right)$ for $g>1$.

This conjectural cost compares very favourably against the best known classical and quantum attacks on $g$-dimensional SIDH. In the classical paradigm, a meet-in-the-middle attack would run in $\widetilde{O}\left(p^{g(g+1) / 8}\right)$, with similar storage requirements. In practice the best attack is the golden-collision van OorschotWiener (vOW) algorithm [38] investigated in [1] which given storage $w$ runs in expected time $\widetilde{O}\left(p^{3 g(g+1) / 16} /(P \sqrt{w})\right)$. For fixed $w$, the attack envisioned above gives an asymptotic improvement over vOW for all $g>1$. If an adversary has access to a large amount of storage, then vOW may still be the best classical algorithm for $g \leq 5$, particularly when smaller primes are used to target lower security levels. (vOW becomes strictly worse for all $g>5$, even if we assume unbounded storage.) In the quantum paradigm, Tani's algorithm 37 would succeed in $\widetilde{O}\left(p^{g(g+1) / 12}\right)$, meaning we get the same asymptotic complexities for dimensions 2 and 3, and an asymptotic improvement for all $g>3$. Moreover, Jaques and Schanck [28] suggest a significant gap between the asymptotic runtime of Tani's algorithm and its actual efficacy in any meaningful model of quantum computation. On the other hand, the bottleneck of the quantum attack forecasted above is a relatively straightforward invocation of Grover search, and the gap between its asymptotic and concrete complexities is likely to be much closer.

Like the size of $S_{g}(p)$, the exponents in the runtime complexities of all of the algorithms above are quadratic in $g$. Indeed, this was the practical motivation for instantiating isogeny-based cryptosystems in $g>1$. In contrast, the exponents for Algorithm 1 and our proposed SIDH attack are linear in $g$. This makes the potential trade-offs for cryptosystems based on higher-dimensional supersingular isogeny problems appear significantly less favourable, particularly as $g$ grows and the gap between the previous best attacks and Algorithm 1 widens.

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## A A proof-of-concept implementation

We include a naive Magma implementation of the product finding stage (i.e. Steps 11(3) of Algorithm 1 in dimension $g=2$ with $\ell=2$. First, it generates a challenge by walking from the known superspecial node corresponding to the curve $\mathcal{C}: y^{2}=x^{5}+x$ over a given $\mathbb{F}_{p^{2}}$ to a random abelian surface in $\Gamma_{2}(2 ; p)$, which becomes the target $\mathcal{A}$. Then it starts computing random walks of length slightly larger than $\log _{2}(p)$, whose steps correspond to (2,2)-isogenies. As each step is taken, it checks whether we have landed on a product of two elliptic curves (at which point it will terminate) before continuing.

Magma's built-in functionality for (2,2)-isogenies makes this rather straightforward. At a given node, the function RichelotIsogenousSurfaces computes all 15 of its neighbours, so our random walks are simply a matter of generating enough entropy to choose one of these neighbours at each of the $O(\log (p))$ steps. For the sake of replicability, we have used Magma's inbuilt implementation of SHA-1 to produce pseudo-random walks that are deterministically generated by an input seed. SHA-1 produces 160 -bit strings, which correspond to 40 integers in $[0,1, \ldots, 15]$; this gives a straightforward way to take 40 pseudo-random steps in $\Gamma_{2}(2 ; p)$, where no step is taken if the integer is 0 , and otherwise the index is used to choose one of the 15 neighbours.

The seed processor can be used to generate independent walks across multiple processors. We always used the seed " 0 " to generate the target surface, and set processor to be the string " 1 " to kickstart a single process for very small primes. For the second and third largest primes, we used the strings " 1 ", " 2 ", ..., " 16 " as seeds to 16 different deterministic processes. For the largest prime, we seeded 128 different processes.

For the prime $p=\mathbf{1 2 7}=2^{7}-1$, the seed " 0 " walks us to the starting node corresponding to $C_{0} / \mathbb{F}_{p^{2}}: y^{2}=(41 i+63) x^{6}+\cdots+(6 i+12) x+70$. The single processor seeded with " 1 " found a product variety $E_{1} \times E_{2}$ on its second walk after taking 53 steps in total, with $E_{1} / \mathbb{F}_{p^{2}}: y^{2}=x^{3}+(93 i+43) x^{2}+(23 i+$ $93) x+(2 i+31)$ and $E_{2} / \mathbb{F}_{p^{2}}: y^{2}=x^{3}+(98 i+73) x^{2}+(30 i+61) x+(41 i+8)$.

For the prime $p=8191=2^{13}-1$, the single processor seeded with " 1 " found a product variety on its 175 -th walk after taking 6554 steps in total.

For the prime $p=\mathbf{5 2 4 2 8 7}=2^{19}-1$, all 16 processors were used. The processor seeded with " 2 " was the first to find a product variety on its 311-th walk after taking 11680 steps in total. Given that all processors walk at roughly the same pace, at this stage we would have walked close to $16 \cdot 11680=\mathbf{1 8 6 8 8 0}$ steps.

For the 25 -bit prime $p=\mathbf{1 7 9 1 5 9 0 3}=2^{13} 3^{7}-1$, the processor seeded with " 13 " found a product variety after taking 341 walks and a total of 12698 steps. At this stage the 16 processors would have collectively taken around 203168 steps.

The largest experiment that we have conducted to date is with the prime $p=\mathbf{2 1 4 7 4 8 3 6 4 7}=2^{31}-1$, where 128 processors walked in parallel. Here the processor seeded with " 95 " found a product variety after taking 10025 walks and a total of 375703 steps. At this stage the processors would have collectively taken around 48089984 steps.

In all of the above cases we see that product varieties are found with around $p$ steps. The Magma script that follows can be used to verify the experiments 5 , or to experiment with other primes.

[^2]
clear;
processor:="1";
$\mathrm{p}:=2^{\wedge} 13-1 ;$
$\mathrm{Fp}:=\mathrm{GF}(\mathrm{p}) ;$
Fp2<i>:=ExtensionField<Fp, x|x^2+1>;
-<x>:=PolynomialRing(Fp2);
////////////////////////////////////////////////////////////////।
Next_Walk := function(str)
H:= SHA1(str);
steps := [StringToInteger(x, 16): $x$ in ElementToSequence(H) | $x$ ne "0"];
end function;

Walk_To_Starting_Jacobian:=function(str)
steps, $\mathrm{H}:=$ Next_Walk(str);
C0: =HyperellipticCurve ( $\mathrm{x}^{\wedge} 5+\mathrm{x}$ );
Jo:=Jacobian (C0);
for $i:=1$ to \#steps do
neighbours:=RichelotIsogenousSurfaces(JO); Jo:=neighbours[steps[i]];
end for
return Jo;
end function;
///////////////////////////////////////////////////////////////
Walk_Until_Found:=function(seed, Jo);
found:=false;
$\mathrm{H}:=$ seed;
$\mathrm{H}:=$ seed;
found: $=$ false;
walks_done: $=0$;
steps_done: $=0$
while not found do
walks_done+:=1
walks_done, "walks and",steps_done, "steps on core", processor, "for $\mathrm{p}=$ ", p
$\mathrm{J}:=\mathrm{JO}$;
steps, $\mathrm{H}:=$ Next_Walk(H);
for $\mathrm{i}:=1$ to \#steps do
teps_done+: $=1$
$J:=$ RichelotIsogenousSurfaces (J) [steps[i]] ;
if Type (J) eq SetCart then
index:=i;
index: break;
end if;
end for;
end while;
return steps,index, walks_done, steps_done, J
end function;
//////////////////////////////////////////////////////////
file_name:="p" cat IntegerToString(p) cat "-" cat processor cat ".txt";
Jo:=Walk_To_Starting_Jacobian("0");
steps, index, walks_done, steps_done, J:=Walk_Until_Found (processor, Jo) ;
Write(file_name, "walks done =");
Write(file_name, walks_done);
Write(file_name, "steps_done =");
Write(file_name, steps_done)
Write(file_name, "steps=");
Write(file_name, steps).
Write(file_name, "index=")
Write (file_name, index);
Write(file_name, "Elliptic Product=");
Write(file_name, J);
//////////////////////////////////////////////////////////


[^0]:    ${ }^{3}$ Our algorithms apply to the full superspecial graph; we do not claim any impact on cryptosystems that run in small and special subgraphs, such as CSIDH 88.

[^1]:    ${ }^{4}$ Isogenies with strictly smaller kernels exist-isogenies with cyclic kernel are treated algorithmically in [16- but these isogenies are not relevant to this investigation.

[^2]:    ${ }^{5}$ Readers without access to Magma can make use of the free online calculator at http://magma.maths.usyd.edu.au/calc/, omitting the "Write" functions at the end that are used to print to local files.

