

An efficient key recovery attack on Supersingular Isogeny Diffie-Hellman (j.w. Thomas Decru)

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1

1. Supersingular Isogeny Diffie-Hellman (SIDH)

Jao, De Feo 2011: can we do Diffie-Hellman with subgroups and quotients?

1/19

2

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1/19

3

1. Supersingular Isogeny Diffie-Hellman (SIDH)

Jao, De Feo 2011: can get around this by using 'auxiliary points'!

2/19

4

1. Supersingular Isogeny Diffie-Hellman (SIDH)

Jao, De Feo 2011: concrete proposal (simplified); choose prime $p = 2^e 3^f - 1$

3/19

5

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3/19

6

4/19

1. Supersingular Isogeny Diffie-Hellman (SIDH)

Alice's isogeny $\varphi_A: E \rightarrow E/A$ can be viewed as a secret walk in the **supersingular 2-isogeny graph** over \mathbb{F}_p .

Ramanujan graph, so: rapid mixing (Pizer 1990)

Key recovery amounts to: Finding an instance of φ_A (or equiv. A) when being given $E, E/A, \varphi_A(P_B), \varphi_A(Q_B)$

7

4/19

1. Supersingular Isogeny Diffie-Hellman (SIDH)

Bob's isogeny $\varphi_B: E \rightarrow E/B$ can be viewed as a secret walk in the **supersingular 3-isogeny graph** over \mathbb{F}_p .

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8

4/19

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point images make for an atypical isogeny problem

9

5/19

1. Supersingular Isogeny Diffie-Hellman (SIDH)

Quick timeline:

- 1994 Shor: **factoring and discrete logs are easy** for quantum computers,
- 1997 Couveignes: isogeny-based key exchange from class group actions on ordinary elliptic curves (rejected and circulated among some experts),
- 2006 Rostovtsev-Stolbunov: rediscover and improve this construction and **suggest post-quantum security**,
- 2006 Charles-Goren-Lauter: hash function from **supersingular isogeny graphs**,
- 2010 Childs-Jao-Soukharev: quantum attack on the Couveignes-Rostovtsev-Stolbunov protocol with runtime $L(1/2)$,
- 2011 Jao-De Feo: respond with **SIDH** — best attack at time of proposal: **claw-finding**

$O(p^{1/4})$ classical and $O(p^{1/6})$ quantum (Tani)

10

6/19

1. Supersingular Isogeny Diffie-Hellman (SIDH)

Quick timeline:

- 2016: SIDH-based system **SIKE** submitted to NIST standardization process,
- 2017: Petit shows how to exploit auxiliary points for **unbalanced** $2^e, 3^f$
 - improved in 2021 by de Quehen et al.,
 - no impact on SIKE,
- 2020: NIST selects SIKE as an "alternate" round-3 candidate,
- 2022: NIST announces winners and **moves SIKE to an extra 4th round**,
- 2022: our work **breaks all security levels of SIKE in $< 1/2$ day**, asymptotically and heuristically:

modulo precomputable factorizations — polytime if starting curve has known endomorphism ring, time $L(1/2 + \epsilon)$ if not (observation by De Feo, Wesolowski),

- 2022: Robert establishes **unconditional polynomial runtime**.

11

7/19

2. Recovering Bob's secret key (easiest and most efficient case)

- Recall: given $E, E/B, \varphi_B(P_A), \varphi_B(Q_A)$, find φ_B .

allows us to consider subgroup $\langle (P_A, \varphi_B(P_A)), (Q_A, \varphi_B(Q_A)) \rangle \subseteq E \times E/B$

This subgroup is isomorphic to $\frac{\mathbb{Z}}{2^e\mathbb{Z}} \times \frac{\mathbb{Z}}{2^f\mathbb{Z}}$

What happens if we quotient it out via an isogeny? We want to do this within the category of **principally polarized abelian surfaces**.

'Historical' note: seeds for this approach lie in a two-year old idea due to Thomas for the **construction** of a certain cryptographic functionality from isogenies, so **destruction** was never the intention!

12

2. Recovering Bob's secret key (easiest and most efficient case) 7/19

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➤ What happens if we quotient it out via an isogeny? We want to do this within the category of **principally polarized abelian surfaces**.

↳ e.g., imagine we can find x such that $x^2 3^f \equiv -1 \pmod{2^a}$, then the modified subgroup $\langle (P_A, xP_A'), (Q_A, xQ_A') \rangle$ is maximally isotropic

(Proof: $e_{2^e}(P_A, Q_A) \cdot e_{2^e}(xP_A', xQ_A') = e_{2^e}(P_A, Q_A) \cdot e_{2^e}(P_A, Q_A)^{x^2 3^f} = 1$)

13

2. Recovering Bob's secret key (easiest and most efficient case) 7/19

➤ Recall: given $E, E/B, \varphi_B(P_A), \varphi_B(Q_A)$, find φ_B .

allows us to consider subgroup $\langle (P_A, \varphi_B(P_A)), (Q_A, \varphi_B(Q_A)) \rangle \subseteq E \times E/B$

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↳ called a " $(2^e, 2^e)$ -subgroup"

14

2. Recovering Bob's secret key 8/19

Resulting $(2^e, 2^e)$ -isogeny decomposes into e $(2, 2)$ -isogenies. Typical case:

However, in very exceptional situations (heuristic probability is $O(1/p)$):

subgroup is called **'reducible'**

15

2. Recovering Bob's secret key 9/19

Characterization of reducible subgroups (Kani 1997):

Definition:
An **isogeny diamond configuration of order N** is a triplet (ψ, G_1, G_2) with

- $\psi : E \rightarrow E'$ isogeny,
- $G_1, G_2 \subseteq \ker \psi$,
- $\deg \psi = \#G_1 \cdot \#G_2, N = \#G_1 + \#G_2, G_1 \cap G_2 = \{0\}$.

Theorem (slightly informal)
An (N, N) -subgroup of $E \times E'$ is reducible iff it "comes from" an isogeny diamond configuration of order N .

roughly means that $((P, x\psi(P)), (Q, x\psi(Q)))$ for $E[N] = \langle P, Q \rangle$ and appropriate $x \in \mathbb{Z}$

16

2. Recovering Bob's secret key 10/19

Back to Bob's secret isogeny

➤ Force it into an **isogeny diamond of order 2^e** :
it is $(\varphi_B \circ \hat{\gamma}, \ker \hat{\gamma}, \gamma(B))$

degree $c = 2^e - 3^f$ (assume positive) $\xrightarrow{\gamma}$

degree 3^f

$E \xrightarrow{\varphi_B} E'$
 $P_A \xrightarrow{\varphi_B} P'_A = \varphi_B(P_A)$
 $Q_A \xrightarrow{\varphi_B} Q'_A = \varphi_B(Q_A)$

$C \xrightarrow{\gamma} E'$
 $P_C = \gamma(P_A)$
 $Q_C = \gamma(Q_A)$

➤ By Kani's theorem, the subgroup $\langle (P_C, P'_A), (Q_C, Q'_A) \rangle \subseteq C \times E'$ is reducible

➤ **Key idea:** if P'_A, Q'_A were **not** the images of P_A, Q_A under a degree- 3^f isogeny, then with overwhelming probability this does **not** result in a reducible subgroup!

17

2. Recovering Bob's secret key 11/19

Leads to the following candidate-method for unveiling Bob's secret walk:

secret 3-isogenies composing to φ_B

isogeny γ of degree $2^e - 3^{f-1}$

$E \xrightarrow{\gamma} E_1 \xrightarrow{\varphi_1} E_2 \xrightarrow{\varphi_2} E_3 \xrightarrow{\varphi_3} \dots \xrightarrow{\varphi_{f-1}} E_{f-1} \xrightarrow{\varphi_f} E'$

$P_A \xrightarrow{\gamma} P_1 \xrightarrow{\varphi_1} P_2 \xrightarrow{\varphi_2} P_3 \xrightarrow{\varphi_3} \dots \xrightarrow{\varphi_{f-1}} P_{f-1} \xrightarrow{\varphi_f} P'_A = \varphi_B(P_A)$

$Q_A \xrightarrow{\gamma} Q_1 \xrightarrow{\varphi_1} Q_2 \xrightarrow{\varphi_2} Q_3 \xrightarrow{\varphi_3} \dots \xrightarrow{\varphi_{f-1}} Q_{f-1} \xrightarrow{\varphi_f} Q'_A = \varphi_B(Q_A)$

if guess is correct, then:

- E_1^2 connected to E' via isogeny of degree 3^{f-1}
- this isogeny maps $P_1^2 \mapsto P'_A$ and $Q_1^2 \mapsto Q'_A$
- so: **build auxiliary isogeny γ and check reducibility** of the subgroup $\langle (P_C, P'_A), (Q_C, Q'_A) \rangle \subseteq C \times E'$.

18

11/19

2. Recovering Bob's secret key

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secret 3-isogenies composing to φ_B

$E \xrightarrow{\varphi_1} E_1 \xrightarrow{\varphi_2} E_2 \xrightarrow{\varphi_3} E_3 \xrightarrow{\varphi_4} \dots \xrightarrow{\varphi_{f-1}} E_{f-1} \xrightarrow{\varphi_f} E'$

$P_A \xrightarrow{\varphi_f} P'_A = \varphi_B(P_A)$
 $Q_A \xrightarrow{\varphi_f} Q'_A = \varphi_B(Q_A)$

isogeny γ of degree $2^e - 3^{f-2}$

$E_2 \xrightarrow{\gamma} E'$

$P_2' = \gamma_2^{\varphi_1}(P_A)$
 $Q_2' = \gamma_2^{\varphi_1}(Q_A)$

C

$P_C = \gamma(P_2')$
 $Q_C = \gamma(Q_2')$

19

11/19

2. Recovering Bob's secret key

Leads to the following candidate-method for unveiling Bob's secret walk:

secret 3-isogenies composing to φ_B

$E \xrightarrow{\varphi_1} E_1 \xrightarrow{\varphi_2} E_2 \xrightarrow{\varphi_3} E_3 \xrightarrow{\varphi_4} \dots \xrightarrow{\varphi_{f-1}} E_{f-1} \xrightarrow{\varphi_f} E'$

$P_A \xrightarrow{\varphi_f} P'_A = \varphi_B(P_A)$
 $Q_A \xrightarrow{\varphi_f} Q'_A = \varphi_B(Q_A)$

isogeny γ of degree $2^e - 3^{f-3}$

$E_3 \xrightarrow{\gamma} E'$

$P_3' = \gamma_3^{\varphi_2}(\varphi_1(P_A))$
 $Q_3' = \gamma_3^{\varphi_2}(\varphi_1(Q_A))$

C

$P_C = \gamma(P_3')$
 $Q_C = \gamma(Q_3')$

and so on...

20

12/19

3. Constructing the auxiliary isogeny γ

At iteration i : want to construct an isogeny

$E \xrightarrow{\dots} E_{i-1} \xrightarrow{\tau} E_i$

$\varepsilon = [u + i[v]]$

isogeny $\tilde{\tau}$ with $\ker \tilde{\tau} = \varepsilon(\ker \tau)$

$C \xrightarrow{\gamma} E_i$ degree $c = 2^e - 3^{f-i}$

We know:

- > a path $\tau : E \rightarrow E_i$.
- > that $E : y^2 = x^3 + x$ comes equipped with $i : E \rightarrow E : (x, y) \mapsto (-x, iy)$

Hope: $c = 2^e - 3^{f-i} = u^2 + v^2 = (u + iv)(u - iv)$ for certain integers u, v .

21

12/19

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isogeny $\tilde{\tau}$ with $\ker \tilde{\tau} = \varepsilon(\ker \tau)$

$C \xrightarrow{\gamma} E_i$ degree $c = \frac{\tilde{\tau} \circ \varepsilon \circ \tau}{3^i}$

We know:

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22

12/19

3. Constructing the auxiliary isogeny γ

Hope: $c = 2^e - 3^{f-i} = u^2 + v^2 = (u + iv)(u - iv)$ for certain integers u, v .

- > Cost of deciding existence of u, v and finding them:
 - factoring c ,
 - Euclid's algorithm over $\mathbf{Z}[i]$ (special case of Cornacchia)
- > Note: **only depends on system parameters**, not on concrete SIDH instance.
- > If c does not admit decomposition: **create more leeway** by
 - reducing e (2^e -torsion info implies 2^{e-j} -torsion info),
 - increasing $f - i$ (extend Bob's secret walk if useful).
- > In practice:
 - need to guess first degree-3 component so that $2^e > 3^{f-i}$,
 - from that point onwards: can guess one degree-3 component at a time.
- > Altogether, attack runs heuristically in time $L(1/4)$, modulo precomputation.

23

13/19

3. Constructing the auxiliary isogeny γ

What about other starting curves than $E : y^2 = x^3 + x$?

Known endomorphism ring:

- > SIKE uses $E : y^2 = x^3 + 6x^2 + x$ which carries endomorphism 2i: same works
- > more general: approach works if $\text{End}(E)$ contains small-norm endomorphism
- > totally general: walk to appropriate curve with small-norm endomorphism
 - ↳ selecting best curve leads to heuristic polynomial time (mod factoring)

Unknown endomorphism ring:

- > auxiliary isogeny can always be constructed if $c = 2^e - 3^{f-i}$ is smooth
- > create more leeway by considering $c = d2^{e-j} - d'3^{f-i}$
 - guess action on d -torsion
 - extend Bob's walk
 - rely on smaller torsion info

24

4. Checking reducibility

14/19

"gluing" formulae due to Howe, Leprévost, Poonen 2000

Richelot isogenies (classical and very efficient)

division by 0 during Richelot

25

4. Checking reducibility

15/19

> Glimpse at Richelot:

Write $H_i : y^2 = f(x)$.

Our $(2,2)$ -subgroup $\{[(\alpha_1, 0) - (\beta_1, 0)], [(\alpha_2, 0) - (\beta_2, 0)], [(\alpha_3, 0) - (\beta_3, 0)], 0\}$ yields factorization

$$f(x) = (g_{12}x^2 + g_{11}x + g_{10}) \cdot (g_{22}x^2 + g_{21}x + g_{20}) \cdot (g_{32}x^2 + g_{31}x + g_{30})$$

\parallel $G_1(x)$ \parallel $G_2(x)$ \parallel $G_3(x)$

$$\delta = \det \begin{pmatrix} g_{12} & g_{11} & g_{10} \\ g_{22} & g_{21} & g_{20} \\ g_{32} & g_{31} & g_{30} \end{pmatrix} \quad G'_i(x) = \frac{1}{\delta} \left(\frac{dG_j}{dx} G_k - G_j \frac{dG_k}{dx} \right)$$

Then $H_{i+1} : y^2 = G'_1(x) \cdot G'_2(x) \cdot G'_3(x)$ for $(i, j, k) = (1, 2, 3), (2, 3, 1), (3, 1, 2)$

26

4. Checking reducibility

15/19

> Glimpse at Richelot:

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\parallel $G_1(x)$ \parallel $G_2(x)$ \parallel $G_3(x)$

$$\delta = \det \begin{pmatrix} g_{12} & g_{11} & g_{10} \\ g_{22} & g_{21} & g_{20} \\ g_{32} & g_{31} & g_{30} \end{pmatrix} \quad \text{unless } \delta = 0 \text{ in which case we land on a product of elliptic curves}$$

Then $H_{i+1} : y^2 = G'_1(x) \cdot G'_2(x) \cdot G'_3(x)$.

27

5. Implementation

16/19

We have implemented the attack in Magma. Current run recovers Bob's key for

- > SIKE level 1 in about 10 minutes,
- > SIKE level 2 in about 20 minutes,
- > SIKE level 3 in about 1 hour,
- > SIKE level 5 in about 3 hours.

Further speed-up through SageMath implementation effort including several algorithmic improvement by Oudompheng, Panny, Pope, ... (see later) — **Magma?**

Generalization to other torsion? No theoretical obstructions but more cumbersome:

- > attacking Alice's key requires computing chains of $(3,3)$ -isogenies: explicit formulae due to Bruin, Flynn, Testa,
- > for arbitrary smooth torsion (e.g. as used in B-SIDH): resort to AVIsogenies package by Bisson, Cosset, Robert.

28

6. Improvements and updates

17/19

1) **Direct evaluation** approach due to Oudompheng, Petit, Wesolowski (see also Maino-Martindale): possible to save many $(2,2)$ -isogenies by completing the diagram

Now $\hat{\varphi}_B$ factors as:

$$\hat{\varphi}_B : E' \rightarrow C \times E' \xrightarrow{\begin{pmatrix} \hat{\gamma} & \hat{\varphi}_B \\ \gamma' & -\varphi'_B \end{pmatrix}} E \times C' \rightarrow E$$

Indeed:

$$X \mapsto (\infty, X) \mapsto (\hat{\varphi}_B(X), -\varphi'_B(X)) \mapsto \hat{\varphi}_B(X).$$

degree $c = 2^e - 3^f$

29

6. Improvements and updates

17/19

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can be verified to:

- be an isogeny of principally polarized abelian surfaces,
- have kernel

so we can simply **evaluate** $\hat{\varphi}_B!$ $\rightarrow \{(3^f P, -\varphi_B \hat{\gamma}(P)) : P \in C[2^e]\}$

30

17/19

6. Improvements and updates

1) **Direct evaluation** approach due to Oudompheng, Petit, Wesolowski (see also Maino-Martindale): possible to save many (2,2)-isogenies by completing the diagram

$$\begin{array}{ccc}
 E & \xrightarrow{\varphi_B} & E' \\
 \downarrow \gamma & & \downarrow \gamma' \\
 C & \xrightarrow{\varphi'_B} & C'
 \end{array}$$

degree $c = 2^e - 3^f$

Now:

- > evaluate $\hat{\varphi}_B$ on basis $\{X, Y\}$ of $E'[3^f]$,
- > determine $\ker \hat{\varphi}_B$ by solving $\hat{\varphi}_B(xX + yY) = x\hat{\varphi}_B(X) + y\hat{\varphi}_B(Y) = \infty$,
- > recover $B = \hat{\varphi}_B(\ker \hat{\varphi}_B)$

31

18/19

6. Improvements and updates

2) Using this and various other speed-ups: SageMath implementation by Pope et al. has **dramatically reduced the attack runtimes**. E.g., SIKE level 1 now falls in 22 seconds.

3) Wesolowski described a direct way of constructing a degree- c isogeny using knowledge of the endomorphism ring, **without assuming special form of c** and **without the need for factorization**; leads to polynomial time only assuming GRH.

4) Re: **smoothness**: using standard heuristics it is easy to obtain $L(1/2)$ -smooth $c = d2^{e-j} - d'3^{f-i}$ with $c, d' \in L(1/2)$. So the algorithm (as does Maino-Martindale's) breaks SIDH with unknown endomorphism ring in $L(1/2 + \epsilon)$. Pointed out by De Feo and Wesolowski.

32

19/19

6. Improvements and updates

5) Beautiful trick by Robert reduces this further to **unconditional polynomial runtime**.

Idea: write $c = a_1^2 + a_2^2 + a_3^2 + a_4^2$ — Lagrange's four-square theorem

Explicit check:

$$M = \begin{pmatrix} a_1 & -a_2 & -a_3 & -a_4 \\ a_2 & a_1 & -a_4 & a_3 \\ a_3 & a_4 & a_1 & -a_2 \\ a_4 & -a_3 & a_2 & a_1 \end{pmatrix} \text{ satisfies } M^t \cdot M = M \cdot M^t = cI.$$

Now

$$F = \begin{pmatrix} M & \hat{\varphi}_B \\ -\hat{\varphi}_B & M^t \end{pmatrix} \in \text{End}(E^4 \times E'^4) \text{ with dual } \hat{F} = \begin{pmatrix} M^t & -\hat{\varphi}_B \\ \hat{\varphi}_B & M \end{pmatrix}$$

satisfies $\hat{F}F = F\hat{F} = (c + 3^f)I = 2^e I$, so $\ker F \subseteq (E^4 \times E'^4)[2^e]$ can be computed from torsion-point info. So we can directly evaluate φ_B as before.

33

19/19

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Now

$$F = \begin{pmatrix} M & \hat{\varphi}_B \\ -\hat{\varphi}_B & M^t \end{pmatrix} \in \text{End}(E^4 \times E'^4) \text{ with dual } \hat{F} = \begin{pmatrix} M^t & -\hat{\varphi}_B \\ \hat{\varphi}_B & M \end{pmatrix}$$

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Note: In the original image, the $\hat{\varphi}_B$ and $-\hat{\varphi}_B$ terms in the matrix F are circled in blue, and an arrow points to the text "component-wise evaluation".

34

Questions?
 Thanks for listening!

35