A battle of bits: building confidence in cryptography

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Negation joint work with: Peter Schwabe Academia Sinica

ECC2K-130 joint work with: many, many, many, many

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But can *estimate* the cost of this algorithm as the cost of the best algorithm known.

Does this estimate inspire confidence? Maybe, maybe not!

How slowly is it changing? Consider matrix-mult exponent: 2.81 (1969). 2.796 (1978). 2.78 (1979). 2.522 (1981). 2.517 (1982). 2.496 (1981). 2.479 (1986). 2.376 (1989).

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How extensive is the literature? "Look at all these people who couldn't find better algorithms."

<u>The rho method</u>

Group $\langle P \rangle$ of prime order ℓ . Discrete-log problem for $\langle P \rangle$: given P, kP, find $k \mod \ell$.

Standard attack: parallel rho.

Expect $(1 + o(1))\sqrt{\pi\ell/2}$

group operations,

- matching lower bound
- from Nechaev/Shoup.
- Easy to distribute across CPUs.
- Very little memory consumption.
- Very little communication.

Simplified, non-parallel rho:

Make a pseudo-random walk in the group $\langle P \rangle$, where the next step depends on current point: $W_{i+1} = f(W_i)$. Birthday paradox: Randomly choosing from ℓ elements picks one element twice after about $\sqrt{\pi\ell/2}$ draws.

The walk now enters a cycle. Cycle-finding algorithm (e.g., Floyd) quickly detects this.


























































Assume that for each point we know $a_i, b_i \in \mathbf{Z}/\ell\mathbf{Z}$ so that $W_i = [a_i]P + [b_i]Q$.

Then $W_i = W_j$ means that $[a_i]P + [b_i]Q = [a_j]P + [b_j]Q$ so $[b_i - b_j]Q = [a_j - a_i]P$. If $b_i \neq b_j$ the DLP is solved: $k = (a_j - a_i)/(b_i - b_j)$. Assume that for each point we know $a_i, b_i \in \mathbf{Z}/\ell\mathbf{Z}$ so that $W_i = [a_i]P + [b_i]Q$.

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e.g. "Additive walk": Start with $W_0 = P$ and put $f(W_i) = W_i + c_j P + d_j Q$ where $j = h(W_i)$. Parallel rho: Perform many walks with different starting points but same update function f. If two different walks find the same point then their subsequent steps will match.

Terminate each walk once it hits a **distinguished point**.

Attacker chooses frequency and definition of distinguished points. Do not wait for cycle.

Collect all distinguished points. Two walks ending in same distinguished point solve DLP.



Elliptic-curve groups



 $y^2 = x^3 + ax + b.$

Elliptic-curve groups



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Elliptic-curve groups



$$y^2 = x^3 + ax + b$$
.
Also neutral element at ∞ .
 $-(x, y) = (x, -y)$.

$$egin{aligned} &(x_{W},y_{W})+(x_{R},y_{R})=\ &(x_{W+R},y_{W+R})=\ &(\lambda^{2}-x_{W}-x_{R},\lambda(x_{W}-x_{W+R})-y_{W}). \end{aligned}$$

$$egin{aligned} x_{W}
eq x_{R}, ext{``addition'':}\ \lambda &= (y_{R}-y_{W})/(x_{R}-x_{W}). \end{aligned}$$
 Total cost $1\mathbf{I}+2\mathbf{M}+1\mathbf{S}. \end{aligned}$

$$W = R$$
 and $y_W \neq 0$, "doubling":
 $\lambda = (3x_W^2 + a)/(2y_W)$.
Total cost $1\mathbf{I} + 2\mathbf{M} + 2\mathbf{S}$.

Also handle some exceptions: $(x_{W}, y_{W}) = (x_{R}, -y_{R});$ inputs at ∞ . For each prime $p \ge 3$ not dividing $4a^3 + 27b^2$: Same formulas for $x, y \in \mathbf{F}_p$ define a group $E_{a,b}(\mathbf{F}_p)$.

Size of this group is element of interval $[p+1-2\sqrt{p}, p+1+2\sqrt{p}]$. "Random" element of interval if *a*, *b* are random mod *p*.

Note 1: Some elliptic curves do not have this form.

Note 2: For typical cryptographic computations, much better to use Edwards form instead.

Negation and rho

W = (x, y) and -W = (x, -y)have same *x*-coordinate. Search for *x*-coordinate collision.

Search space for collisions is only $\lceil \ell/2 \rceil$; this gives factor $\sqrt{2}$ speedup ... if $f(W_i) = f(-W_i)$.

To ensure $f(W_i) = f(-W_i)$: Define $j = h(|W_i|)$ and $f(W_i) = |W_i| + c_j P + d_j Q$. Define $|W_i|$ as, e.g., lexicographic minimum of W_i , $-W_i$. Problem: this walk can run into fruitless cycles!

Example: If
$$|W_{i+1}| = -W_{i+1}$$

and $h(|W_{i+1}|) = j = h(|W_i|)$
then $W_{i+2} = f(W_{i+1}) =$
 $-W_{i+1} + c_j P + d_j Q =$
 $-(|W_i| + c_j P + d_j Q) + c_j P + d_j Q =$
 $-|W_i|$ so $|W_{i+2}| = |W_i|$
so $W_{i+3} = W_{i+1}$
so $W_{i+4} = W_{i+2}$ etc.

If h maps to r different values then expect this example to occur with probability 1/(2r)at each step.

Current ECDL record:

2009.07 Bos–Kaihara– Kleinjung–Lenstra–Montgomery "PlayStation 3 computing breaks 2⁶⁰ barrier: 112-bit prime ECDLP solved".

Standard curve over \mathbf{F}_p where $p = (2^{128} - 3)/(11 \cdot 6949)$.

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"We did not use the common negation map since it requires branching and results in code that runs slower in a SIMD environment." All modern CPUs are SIMD. 2009.07 Bos–Kaihara–Kleinjung– Lenstra–Montgomery "On the security of 1024-bit RSA and 160bit elliptic curve cryptography":

Group order $q \approx p$;

"expected number of iterations" is " $\sqrt{\frac{\pi \cdot q}{2}} \approx 8.4 \cdot 10^{16}$ "; "we do not use the negation map"; "456 clock cycles per iteration per SPU"; "24-bit distinguishing property" \Rightarrow "260 gigabytes".

"The overall calculation can be expected to take approximately 60 PS3 years." 2009.09 Bos–Kaihara– Montgomery "Pollard rho on the PlayStation 3":

"Our software implementation is optimized for the SPE ... the computational overhead for [the negation map], due to the conditional branches required to check for fruitless cycles [13], results (in our implementation on this architecture) in an overall performance degradation."

"[13]" is 2000 Gallant–Lambert– Vanstone. 2010.07 Bos–Kleinjung–Lenstra "On the use of the negation map in the Pollard rho method":

"If the Pollard rho method is parallelized in SIMD fashion, it is a challenge to achieve any speedup at all. . . Dealing with cycles entails administrative overhead and branching, which cause a non-negligible slowdown when running multiple walks in SIMD-parallel fashion. . . [This] is a major obstacle to the negation map in SIMD environments."

Our software solves random ECDL on the same curve (with no precomputation) in 35.6 PS3 years on average.

For comparison: Bos–Kaihara–Kleinjung–Lenstra– Montgomery software uses 65 PS3 years on average. Our software solves random ECDL on the same curve (with no precomputation) in 35.6 PS3 years on average.

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Computation used 158000 kWh (if PS3 ran at only 300W), wasting >70000 kWh, unnecessarily generating >10000 kilograms of carbon dioxide. (0.143 kg CO2 per Swiss kWh.) Several levels of speedups, starting with fast arithmetic mod $p = (2^{128} - 3)/(11 \cdot 6949)$ and continuing up through rho.

Most important speedup: We use the negation map. Several levels of speedups, starting with fast arithmetic mod $p = (2^{128} - 3)/(11 \cdot 6949)$ and continuing up through rho.

Most important speedup: We use the negation map.

Extra cost in each iteration: extract bit of "*s*"

(normalized y, needed anyway); expand bit into mask;

use mask to conditionally

replace (s, y) by (-s, -y).

5.5 SPU cycles ($\approx 1.5\%$ of total). No conditional branches. Bos–Kleinjung–Lenstra say that "on average more elliptic curve group operations are required per step of each walk. This is unavoidable" etc.

Specifically: If the precomputed additive-walk table has r points, need 1 extra doubling to escape a cycle after $\approx 2r$ additions. And more: "cycle reduction" etc.

Bos–Kleinjung–Lenstra say that the benefit of large *r* is "wiped out by cache inefficiencies." There's really no problem here!

We use r = 2048. 1/(2r) = 1/4096; negligible. Recall: p has 112 bits. 28 bytes for table entry (x, y). We expand to 36 bytes to accelerate arithmetic. We compress to 32 bytes by insisting on small x, y; very fast initial computation. Only 64KB for table. Our Cell table-load cost: 0. overlapping loads with arithmetic. No "cache inefficiencies."

What about fruitless cycles?

We run 45 iterations. We then save s; run 2 slightly slower iterations tracking minimum (s, x, y); then double tracked (x, y)if new s equals saved s.

(Occasionally replace 2 by 12 to detect 4-cycles, 6-cycles. Such cycles are almost too rare to worry about, but detecting them has a completely negligible cost.) Maybe fruitless cycles waste some of the 47 iterations.

... but this is infrequent. Lose $\approx 0.6\%$ of all iterations.

Tracking minimum isn't free, but most iterations skip it! Same for final *s* comparison. Still no conditional branches. Overall cost $\approx 1.3\%$.

Doubling occurs for only $\approx 1/4096$ of all iterations. We use SIMD quite lazily here; overall cost $\approx 0.6\%$.

Can reduce this cost further.

Check by running experiments! e.g. Try 1000 experiments; check that average time is very close to our predictions.

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Solution: Try same algorithm at some smaller scales.

Our software works for any curve $y^2 = x^3 - 3x + b$ over the same \mathbf{F}_p . Same cost of field arithmetic, same cost of curve arithmetic. $u^2 = x^3 - 3x + 238^2$ has a point of order $\approx 2^{50}$. $u^2 = x^3 - 3x + 372^2$ has a point of order $\approx 2^{55}$. $u^2 = x^3 - 3x + 240^2$

has a point of order $\approx 2^{60}$.

We tried > 32000 experiments on each of these curves.

Found distinguished points at the predicted rates.

Found discrete logarithms using the predicted number of distinguished points.

Negation conclusions: Sensible use of negation, with or without SIMD, has negligible impact on cost of each iteration. Impact on number of iterations is almost exactly $\sqrt{2}$. Overall benefit is extremely close to $\sqrt{2}$.

How to evaluate security

for sparse families?

Get people to solve big challenges!

1997: Certicom announces several elliptic-curve challenges.

"The Challenge is to compute the ECC private keys from the given list of ECC public keys and associated system parameters. This is the type of problem facing an adversary who wishes to completely defeat an elliptic curve cryptosystem." Goals: help users select key sizes; compare random and Koblitz; compare \mathbf{F}_{2^m} and \mathbf{F}_p ; etc.

How to get them hooked?

- 1997: ECCp-79 broken by Baisley and Harley.
- 1997: ECC2-79 broken by Harley et al.
- 1998: ECCp-89, ECC2-89 broken by Harley et al.
- 1998: ECCp-97 broken by Harley et al. (1288 computers).
- 1998: ECC2K-95 broken by Harley et al. (200 computers).
- 1999: ECC2-97 broken by Harley et al. (740 computers).
- 2000: ECC2K-108 broken by Harley et al. (9500 computers).
More challenging challenges

Certicom: "The 109-bit Level I challenges are feasible using a very large network of computers. The 131-bit Level I challenges are expected to be infeasible against realistic software and hardware attacks, unless of course, a new algorithm for the ECDLP is discovered."

- 2002: ECCp-109 broken by Monico et al. (10000 computers).
- 2004: ECC2-109 broken by Monico et al. (2600 computers). open: ECC2K-130

in two years on average by

• 1595 Phenom II x4 955 CPUs,

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Certicom has now backpedaled, saying that ECC2K-130 "may be within reach".

The target: ECC2K-130

The Koblitz curve $y^2 + xy = x^3 + 1$ over $\mathbf{F}_{2^{131}}$ has 4ℓ points, where ℓ is prime. Field representation uses irreducible polynomial $f = z^{131} + z^{13} + z^2 + z + 1$.

Certicom generated their challenge points as two random points in order-*l* subgroup by taking two random points on the curve and multiplying them by 4.

This produced the following points P, Q:

x(P) = 05 1C99BFA6 F18DE467 C80C23B9 8C7994AA y(P) = 04 2EA2D112 ECEC71FC F7E000D7 EFC978BD x(Q) = 06 C997F3E7 F2C66A4A 5D2FDA13 756A37B1 y(Q) = 04 A38D1182 9D32D347 BD0C0F58 4D546E9A

(unique encoding of $\mathbf{F}_{2^{131}}$ in hex).

The challenge: Find an integer $k \in \{0, 1, \dots, \ell - 1\}$ such that [k]P = Q.

Bigger picture:

128-bit curves have been proposed for real (RFID, TinyTate).

Equivalence classes for Koblitz curves

P and -P have same *x*-coordinate. Search for *x*-coordinate collision. Search space is only $\ell/2$; this gives factor $\sqrt{2}$ speedup provided that $f(P_i) = f(-P_i)$.

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More savings: P and $\sigma^i(P)$ have $x(\sigma^j(P)) = x(P)^{2^j}$.

Consider equivalence classes under Frobenius and \pm ;

gain factor $\sqrt{2n} = \sqrt{2 \cdot 131}$.

Need to ensure that the iteration function satisfies $f(P_i) = f(\pm \sigma^j(P_i))$ for any j. Savings is $\sqrt{2 \cdot 131}$ iterations but the iteration function has become slower. How much slower? Savings is $\sqrt{2 \cdot 131}$ iterations but the iteration function has become slower. How much slower?

Could again define adding walk starting from $|P_i|$.

Redefine $|P_i|$ as canonical representative of class containing P_i : e.g., lexicographic minimum of P_i , $-P_i$, $\sigma(P_i)$, etc.

Iterations now involve many squarings, but squarings are not so expensive in characteristic 2.

Iteration function for Koblitz curves

Normal basis of finite field $\mathbf{F}_{2^{n}}$ has elements $\{\zeta, \zeta^{2}, \zeta^{2^{2}}, \zeta^{2^{3}}, \dots, \zeta^{2^{n-1}}\}.$ Representation for x and x^{2} $\sum_{i=0}^{n-1} x_{i} \zeta^{2^{i}} = (x_{0}, x_{1}, x_{2}, \dots, x_{n-1})$ $\sum_{i=1}^{n} x_{i} \zeta^{2^{i}} = (x_{n-1}, x_{0}, \dots, x_{n-2})$ using $(\zeta^{2^{n-1}})^{2} = \zeta^{2^{n}} = \zeta.$

Harley and Gallant-Lambert-Vanstone use that in normal basis, x(P) and $x(P)^{2^j}$ have same Hamming weight $HW(x(P)) = \sum_{i=0}^{n-1} x_i$ (addition over **Z**). Suggestion:

 $P_{i+1}=P_i+\sigma^j(P_i)$,

as iteration function.

Choice of j depends on HW(x(P)).

This ensures that the walk is well defined on classes since $f(\pm \sigma^m(P_i)) =$ $\pm \sigma^m(P_i) + \sigma^j(\pm \sigma^m(P_i)) =$ $\pm (\sigma^m(P_i) + \sigma^m(\sigma^j(P_i))) =$ $\pm \sigma^m(P_i + \sigma^j(P_i)) =$ $\pm \sigma^m(P_{i+1}).$ GLV suggest using j = hash(HW(x(P))),where the hash function maps to [1, n].

Harley uses a smaller set of exponents; for his attack on ECC2K-108 he takes $j \in \{1, 2, 4, 5, 6, 7, 8\};$ computed as $j = (HW(x(P)) \mod 7) + 2$ and replacing 3 by 1.

Our choice of iteration function

Restricting size of *j* matters squarings are cheap but:

- in bitslicing need to compute all powers (no branches allowed);
- code size matters
 (in particular for Cell CPU);
- logic costs area for FPGA;
- having a large set doesn't actually gain much randomness.

Optimization target: time per iteration $\times \#$ iterations.

How to mention lattices?

Having few coefficients lets us exclude short fruitless cycles.

To do so, compute the shortest vector in the lattice $\left\{ v: \prod_{j} (1 + \sigma^{j})^{v_{j}} = 1 \right\}$. Usually the shortest vector has negative coefficients (which cannot happen with the iteration); shortest vector with positive coefficients is somewhat longer.

For implementation it is better to have a continuous interval of exponents, so shift the interval if shortest vector is short. Our iteration function:

 $P_{i+1} = P_i + \sigma^j(P_i)$ where $j = (HW(x(P))/2 \mod 8) + 3$, so $j \in \{3, 4, 5, 6, 7, 8, 9, 10\}$. Shortest combination of these powers is long. Note that HW(x(P)) is even.

Iteration consists of

- computing the Hamming weight HW(x(P)) of the normal-basis representation of x(P);
- checking for distinguished points (is $HW(x(P)) \le 34$?);

• computing j and $P + \sigma^{j}(P)$.

Analysis of our iteration function

For a perfectly random walk $\approx \sqrt{\pi \ell/2}$ iterations are expected on average. Have $\ell \approx 2^{131}/4$ for ECC2K-130.

A perfectly random walk on classes under \pm and Frobenius would reduce number of iterations by $\sqrt{2 \cdot 131}$.

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A perfectly random walk on classes under \pm and Frobenius would reduce number of iterations by $\sqrt{2 \cdot 131}$.

Loss of randomness from having only 8 choices of *j*. Further loss from non-randomness of Hamming weights: Hamming weights around 66 are much more likely than at the edges; effect still noticeable after reduction to 8 choices. Hamming weights around 66 are much more likely than at the edges; effect still noticeable after reduction to 8 choices.

Our $\sqrt{1 - \sum_{i} p_{i}^{2}}$ heuristic says that the total loss is 6.9993%. (Higher-order anti-collision analysis: actually above 7%.) This loss is justified by the very fast iteration function. Hamming weights around 66 are much more likely than at the edges; effect still noticeable after reduction to 8 choices.

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Average number of iterations for our attack against ECC2K-130: $\sqrt{\pi \ell / (2 \cdot 2 \cdot 131)} \cdot 1.069993$ $\approx 2^{60.9}$

<u>Endomorphisms</u>

In general, an efficiently computable endomorphism ϕ of order r speeds up Pollard rho method by factor \sqrt{r} . This theoretical speedup can usually be realized in practice it just requires some work.

Can define walk on classes by inspecting all 2r points $\pm P, \pm \phi(P), \ldots, \pm \phi^{r-1}(P)$ to choose unique representative for class and then doing an adding walk; but this is slow.

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bit operations gives good indication for complexity on FPGAs; is also meaningful for speed of bitsliced software.

<u>Graphics cards</u> GTX 295 without fans, case:





Why GPUs are interesting

NVIDIA GTX 295 graphics card has two GPUs.

Each GPU has 30 cores

running at 1.242GHz.

(NVIDIA: "30 multiprocessors.")

Each core can perform 8 32-bit operations/cycle. Total GTX 295 power: 480 32-bit ops/cycle. (NVIDIA: "480 cores.")

 $> 2^{39}$ 32-bit ops/second. $> 2^{69}$ 1-bit ops/year. Compare to Cell SPEs:

6 cores running at 3.2GHz. Each core can perform 4 32-bit operations/cycle. Total power: 24 32-bit ops/cycle.

Despite low clock speed, GTX 295 can do $> 7 \times$ more operations/second than Cell. Similar price to Cell.

Newer GPUs are even faster.

Why GPUs are difficult

GPU core issues each instruction to many threads. Using full GPU power is difficult with < 192 threads, impossible with < 128 threads.

All data used by these threads must fit into core's SRAM: 65536 bytes of registers, 16384 bytes of shared memory.

Copying data from DRAM has huge latency, low throughput.
GPU results

Best speed with NVIDIA compiler: \approx 3000 cycles/iteration.

Gave up on compiler, built new GPU assembly language, rewrote the software: 1379 cycles/iteration.

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Lower bound for arithmetic: 273 cycles/iteration. Main slowdown: loads + stores.

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534 · 2 · 365 · 24

 $= 9\,355\,680 < 10\,000\,000.$

World of Warcraft: 10 million subscribers who invest heavily in their own graphics cards.

 $534 \cdot 2 \cdot 365 \cdot 24$ = 9355680 < 10000000.

All we need is

1 hour of World of Warcraft!