Learning about Computer Arithmetic by Formally Verifying It

John Harrison Amazon Web Services

RAIM Meeting 2025

Wed 5th Nov 2025 (11:00-12:00)

1998-2017: Verifying floating-point arithmetic at Intel



At the IEEE floating-point meeting 2006

2018-?: Verifying crypto bignums at AWS



AWS's Automated Reasoning Group in 2019

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- ► Technological progress opens up new sub-areas of application
- Many mathematical similarities and analogies

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- We want efficiency and correctness and security
 - 'Constant-time' code

Motivations for FP verification

How Number Theory Got the Best of the Pentium Chip

Chair one ight of number theory. With airds accounts of the first in Intel® Persian processor making front-page and network news, users of the personal computer che in fieldstranging from science on brailing are finding more where it failly large earls their comgone undetected for much forager if thegone undetected for much forager if thechy had not slipped up months ago during a long series of calculations in number theory, raining the sungitions of a diagonal mathematinishing the superiors of the contract of the contraction of the contract of the contraction of the contract mathematical contraction of the contract mathematical contraction of the contract mathematical contraction of the contracti

To ofter authermission, the discovery of the flaw IT broms Nicle of Lendburg Callege in Virginia emphasises the where of manular theory—discovery of the discovery of the control of the compared with the compared theory and the compared theory and the compared the c

ematicians think that might be a good indetroil had actually local that first by other means after the chip had goes into production, but had decided that it was not fluid you affect endiancy seen. But the company hash's with the company of the company hash's which had been affected to the company hash's When he for the year. The company hash's When he for the year is produced to the company hash when he for the part of the company hash but had been a produced to the company hash when he for the part has been a produced to have been a produced to the produced to the war triving no improve on previous continues of a number called Pearl's sea, which is related to the distribution of prime number of

The segence of prime numbers—2, 5, 7, 1, 11, 13, 17, 19, e.m. a continuing search of the control of the control

10,007 and 10,009, for example.

Mathematicians conjecture that such "twin primes" pop up infinitely often. But in 1919, the Norwegian mathematician Viggo

Brun proved that even if there are infinitely more twin prints, the sum obtained by adding their reciprocals—the sum (1/3 + 1/5) + (1/5 + 1/7) + (1/11 + 1/13) + ... —convergesto a finite value, much as the sum <math>(1/2 + 1/4 + 1/6 + ...) converges to 1. Beath's sum is known only to the first five digate, however—and even there, the accuracy is based on consistences about the frequency with

"In desperation, I ran this portion of the calculation on one of the 486s. ... The error disappeared."

—Thomas Nicely

are larking among very large numbers, but they have been unable to prove it. One way to check up on this assumption is to compute better estimates for Brun's sum.

In 1974, two mathematicians weeking for the Nawy, Dansel Shariks and John Wrench Je, reported the first computationally in tensive estimate of Brain's sun, based or the occurrence of twin pennes among the first two million peime grambers. Two year

from which he computed an estimate of DSCRROSS for Bour's sum. DSCRROSS for Bour's sum. DSCRROSS for Bour's sum, and the deep gentre. The Lynchburg marks professor decided to pash Bernis' work into the triflions. To be on the safe side, he computed Bran's sum rocke, using two different methodis the "case" way using a corruptor's bullbran's sum rocke, using two different methodis the "case" way using a corruptor's bullman of the sum of the same and the same and the same method of the same and the same and the same way using an extended precision arithmetic. which he set to pre 26 (entil lates \$33 \text{ light of }

.....

RESEARCH NEWS

1/3 + 1/7 = 10/21 = 0.48. The latter calculation gains accuracy by doing some exact arithmetic first.)

The comparison between the two methods is what got Intel into trouble. After

Noch added the new Pentains to be arbited for the wards was much begre that it is should be been by the rail and mer and a sound of the wards was much begre that it is should be been by the rail and mer and a sound of the rail and the rail

calcot the error. He nestrial firsttiting no satisfactory amove by the end of the mooth, write small aiking others to double-check his discovery. If billieve you are aware of events from that yours on, he coroladed cityly pour on, he coroladed cityly pour on, he coroladed cityly others have abundantly confirmed, lies in the way the chip doued/vision. Although it weeks fine for most runtbers, the chip's built on algorithm makes

like a gade-schooler who has nismeratorized part of a multiplication table. Nicely estimates that the chip gats roughly one in a billion reciprocals wrong. But because the work in number theory required him to compute billions of reciprocals over a wide range, he was almost bound to num into the ministed.

"We've known for a leng time that number theory computations are very helpful" for numing up computer errors, notes computations, notes computed or the computational number theorist Arjen Lentra of Bellcore, in Morristown, New Jersey. "It is useful to run number theory stuff on your processor before you sell it." I med hasely decided whether to make such

inten name (decide whereir to make stars computations a routine part of lits testing procedure, sups Stephen Senith, engeneering maraquer for the Pentiam processed division. But lated was so impressed with Niccely's work that it asked him to run further computations on a corrected chip. "We looked at him as the most thorough tester," says Smith.—Barry Capes.

—Barry Capes.

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Motivations for crypto verification



紙CVE-2017-3736 Detail

MODIFIED

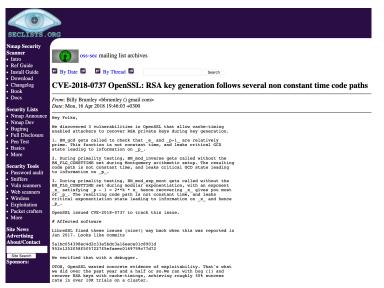
This vulnerability has been modified since it was last analyzed by the NVD. It is awaiting reanalysis which may result in further changes to the information provided.

Current Description

There is a carry propagating bug in the x86_64 Montgomery squaring procedure in OpenSSL before 1.0.2m and 1.1.0 before 1.1.0g, No EC algorithms are affected. Analysis suggests that attacks against RSA and DSA as a result of this defect would be very difficult to perform and are not believed likely. Attacks against DH are considered just feasible (although very difficult) because most of the work necessary to deduce information about a private key may be performed offline. The amount of resources required for such an attack would be very significant and likely only accessible to a limited number of attackers. An attacker would additionally need online access to an unpatched system using the target private key in a scenario with persistent DH parameters and a private key that is shared between multiple clients. This only affects processors that support the BMI1, BMI2 and ADX extensions like Intel Broadwell (5th generation) and later or AMD Ryzen.

https://nvd.nist.gov/vuln/detail/CVE-2017-3736

... and it's not just correctness



https://seclists.org/oss-sec/2018/q2/50

...and it's not just the big libraries

THE PARIS256 ATTACK

Or, Squeezing a Key Through a Carry Bit.

Sean Devlin, Filippo Valsorda

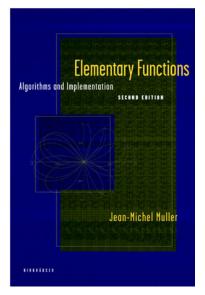
Introduction

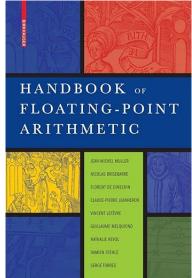
We present an adaptive key recovery attack exploiting a small carry propagation bug in the Go standard library implementation of the NIST P-256 elliptic curve, reported to the Go project as <u>issue 20040</u>.

Following our attack, the vulnerability was assigned CVE-2017-8932, and caused the release of Go 1.7.6 and 1.8.2.

 $\label{lem:https://i.blackhat.com/us-18/Wed-August-8/us-18-Valsorda-Squeezing-A-Key-Through-A-Carry-Bit-wp.pdf$

From folklore to textbooks





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- FMA-based division and square root: Markstein, Computation of Elementary Functions on the IBM RISC System/6000 Processors
- Computation of transcendental functions: Tang, Table-driven implementation of the exponential function in IEEE floating-point arithmetic
- General floating-point "magic":
 - Sterbenz, Floating-Point Computation
 - ► Goldberg, What every computer scientist should know about floating-point arithmetic
 - Kahan, passim

Exact sum and exact product

The exact sum property was relatively well-known (Sterbenz, Goldberg)

```
|- a IN iformat fmt \land b IN iformat fmt \land a / 2 <= b \land b <= 2 * a \Rightarrow (b - a) IN iformat fmt
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The corresponding multiplicative one was more obscure, perhaps because FMA was then not widely used or standardized:

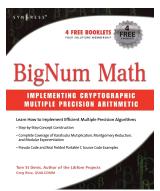
```
|- a IN iformat fmt ∧ b IN iformat fmt ∧
2 pow (2 * precision fmt - 1) / 2 pow (ulpscale fmt)
<= abs(a * b)
⇒ (a * b - round fmt Nearest (a * b)) IN iformat fmt</pre>
```

http://www.cs.berkeley.edu/~wkahan/ieee754status/ieee754.ps

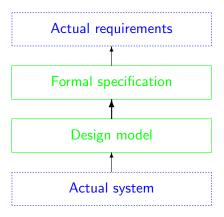
We need the textbooks for cryptographic arithmetic!

These two together probably come closest.

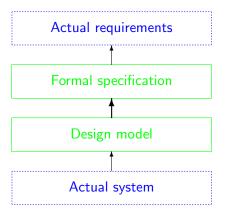




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For us, the spec is pretty easy to formalize, purely mathematical and almost formal already.

... or do we?

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At the boundary 2^k between 'binades', this distance changes, which makes it tricky.

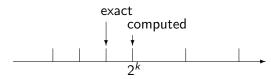
Goldberg's definition of ulp

In general, if the floating-point number $d.d\cdots d \times \beta^e$ is used to represent z, it is in error by $|d.d\cdots d-(z/\beta^e)|\beta^{p-1}e$ units in the last place.

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So this is an error of 0.5ulp according to Goldberg, but intuitively it should be 1ulp.



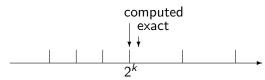
Kahan's definition of ulp

ulp(x) is the gap between the two floating-point numbers nearest x, even if x is one of them.

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According to that definition this is an error of 0.4ulp, but intuitively it should be 0.2ulp. Rounding up is worse...



Ambiguity in Ed25519 signature specification

This signature scheme is one of the most widely used for verifying the authenticity of messages, and is standardized in RFC 8032

Internet Research Task Force (IRTF)
Request for Comments: 8032
Category: Informational
ISSN: 2070-1721

S. Josefsson SJD AB I. Liusvaara Independent January 2017

Edwards-Curve Digital Signature Algorithm (EdDSA)

Abstract

This document describes elliptic curve signature scheme Edwards-curve Digital Signature Algorithm (EdDSA). The algorithm is instantiated with recommended parameters for the edwards25519 and edwards448 curves. An example implementation and test vectors are provided.

The central operation in signature verification involves arithmetic on elliptic curve points B, R and A', with [k]G denoting scalar multiplication of a group element G by an integer k, i.e $G+G+\ldots+G$ (k times)

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Most implementations check yet a different equation [S]B = R + [k MOD n]A where n is the order of the basepoint B. These are all equivalent for well-formed signatures and do not affect the key security properties. Nevertheless, the *full* group order is 8n, so for general points on the curve, these three equations are inequivalent in general.

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These new areas are rich and attractive targets for formal specification and verification.

Mathematical similarity: bounds reasoning

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In both domains, some formal counterpart of interval reasoning is useful, as implemented by tools like GAPPA:

- ▶ In floating-point arithmetic the end result may well be stated as a bound on some overall error term, and automation can help compute it.
- ▶ In both cases, it can be used to prove the absence of overflow/underflow so
 - Floating-point results stay finite and/or normalized giving better relative error biounds
 - Integer operations are exact because they don't wrap round.

Mathematical analogy: MSB versus LSB algorithms

Floating-point numbers, usually being normalized, naturally lend themselves to algorithms based on the 'most significant bit'.

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Nevertheless there are often strong similarities between 'metrical' (MSB) and '2-adic' (LSB) algorithms (see table in Brent-Zimmermann).

Using Newton's method for reciprocals

Floating-point computation of 1/a:

- Form initial approximation $y \approx \frac{1}{a}$
- ► Then iterate $y' = y \cdot (2 ay) = y + y \cdot (1 ay)$

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If $y = \frac{1}{a}(1+\epsilon)$ then $y' = \frac{1}{a}(1-\epsilon^2)$, the classic quadratic convergence where we get twice as many bits of accuracy per iteration.

Modular inverses by Hensel lifting

Consider the 1-word (negated) modular inverse, called word_negmodinv in s2n-bignum.

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Given a 64-bit unsigned and *odd* integer a, returns another 64-bit integer x such that $ax \equiv -1 \pmod{2^{64}}$, i.e. that

It is implemented in a directly similar way using Hensel lifting, the *p*-adic analog of Newton's method.

Initial approximation

As with the floating-point inverse, we need an initial approximation to start with. The following piece of magic (in C syntax):

$$x = (a - (a << 2))^2$$

happens to give a 5-bit negated modular inverse, assuming a is odd.

Given a k-bit approximation $ax \equiv -1 \pmod{2^k}$, do the same Newton step with integers, except for a sign flip because we want a negated inverse:

```
e = a * x + 1;

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https://github.com/awslabs/s2n-bignum

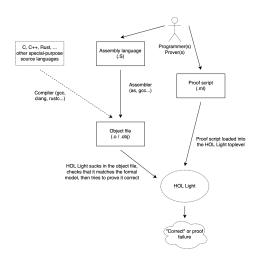
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 $\verb|https://github.com/awslabs/s2n-bignum|$

All hand-written or specially generated 64-bit ARM and x86 machine code.

Coding and verification flow



Comparison with ther crypto verification projects

Formally verified cryptography projects can be placed on this spectrum:

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Formally verified cryptography projects can be placed on this spectrum:

- ► Correct-by-construction coding (HACL*, Jasmin)
- **.**...
- ► A bit of both or somewhere in between (Fiat)
- Separate verification (CryptoLine, s2n-bignum)

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- Much more work involved writing code at this level, less structured representation.
- ©/© Exposure of low-level details like exact stack and PC offsets and particular registers.

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$$\begin{array}{rcl}
 r & = & a - bq \\
 q' & = & q + ry
 \end{array}$$

using round-to-nearest in each case, yields the correctly rounded-to-nearest quotient q'. (Markstein)

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Simply changing to this unlocks more efficient algorithms:

...y approximates
$$\frac{1}{b}$$
 to a relative error $<\frac{1}{2^p}$, ...

The Intel work started as verifying pre-existing code, but sometimes the proof unlocked efficiency improvements.

If q is a floating point number within 1 ulp of the true quotient a/b of two floating point numbers, and y is the correctly rounded-to-nearest approximation of the exact reciprocal $\frac{1}{b}$, then the following iteration:

$$\begin{array}{rcl}
 r & = & a - bq \\
 q' & = & q + ry
 \end{array}$$

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Simply changing to this unlocks more efficient algorithms:

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And the proof is shorter!



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- ► Later we have sometimes taken code or algorithms from other libraries (e.g. Lenngrenn's X25519 code, mlkem-native) and added formal proofs post-hoc.
- Some of the algorithms would be difficult to trust without a formal proof.

GCD and modular inverse using divstep

Classic binary gcd is attractive and simple

```
\gcd(2n, 2m) = 2\gcd(n, m)
\gcd(2n+1, 2m) = \gcd(2n+1, m)
\gcd(2n, 2m+1) = \gcd(n, 2m+1)
\gcd(2n+1, 2m+1) = \gcd(\min(2n+1, 2m+1), |m-n|)
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The Bernstein-Yang divstep algorithm replaces the magnitude comparison with a single-word proxy δ (assume n is odd):

$$\mathsf{divstep}(\delta, n, m) = \begin{cases} (1 - \delta, m, (m - n)/2) & \text{if } \delta > 0 \land \mathsf{odd}(m) \\ (1 + \delta, n, (m + (m \bmod 2)n)/2) & \text{otherwise.} \end{cases}$$

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However the bound/termination reasoning is much more complex.

Dan Bernstein's formal bounds proof

Fortunately the inventor of the algorithm learned HOL Light and proved the bound for us:



Side-channels and "constant-time"

There are many side-channels by which systems may 'leak' secret info (like a private key) to an observer:

- Execution time
- Memory access pattern
- ► Power consumption
- Electromagnetic radiation emitted
- **.** . . .
- ► Microarchitectural bugs

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However, *Hertzbleed: Turning Power Side-Channel Attacks Into Remote Timing Attacks on x86* shows how to mount power attacks remotely via frequency scaling.

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- ▶ Add randomization or salting to the algorithm
- ► Balance timing of paths
- ▶ Just make it too fast to observe
- ► Always perform exactly the same operations regardless of (secret) data. ← Our chosen solution

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When there is control flow depending on secret data:

if
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convert it into dataflow using masking, conditional moves etc.

```
b = (n < p) - 1;

n = n - (p & b);
```

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b = (((\tilde{n} \& p) | ((\tilde{n} | p) \& (n - p))) >> 63) - 1;
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$$b = (((^n \& p) | ((^n | p) \& (n - p))) >> 63) - 1;$$

Another motivation for working directly in machine code where flags and useful instructions like CMOV and CSEL are available.

Are the machine instructions constant-time?

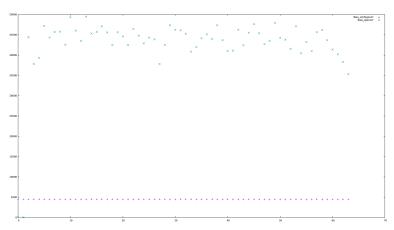
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- Some definitely not, e.g. division by zero is special
- ▶ General assumption that simple things like add, mul mostly are Recently CPUs have started offering *some* guarantees (DIT bit or DOIT mode).

Some empirical results on timing

Times for 384-bit modular inverse at bit densities 0–63, nanoseconds on Intel® Xeon® Platinum 8175M, 2.5 GHz.



Questions?