Picture credit: Rick Bowmer/AP



How to use the new 65-megawatt Bluffdale supercomputer: a gentle introduction to cryptanalysis

D. J. BernsteinUniversity of Illinois at Chicago &Technische Universiteit Eindhoven

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- 5. Also assuming use of traditional transistors+wires, probably with some optics; plus long-term storage. Quantum computing would require different analysis.

# Cryptographic challenges

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User needs crypto to be fast on devices designed primarily for doing something else:



User also needs crypto to be **secure**.

## Some examples of crypto failing:

- 2009 exploit of RSA-512 signatures in TI calculators (small public computation);
- 2010 exploit of ECDSA signatures in PlayStation 3 (trivial—stupid Sony mistake);
- 2012 exploit of MD5-based signatures by Flame malware (somewhat larger computation).

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Presumably many more examples not known to the public.

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Heavy interactions between high-level algorithms and low-level computer architecture.

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Experiments aren't perfect but catch many errors; resolve many disputes; provide raw data leading to new theories; build more confidence than theory alone can ever produce.

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Of course not.

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What if measurements are too expensive to carry out? Measurements start with scaled-down experiments, work up towards the scale of interest.

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Particularly error-prone: cryptanalytic extrapolations from an academic computation to a serious real-world attack.

We catch errors, resolve disputes by carrying out experiments: actually running these algorithms on the largest scale we can.

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Actual security of RSA-1024 is still a matter of dispute: e.g., 2009 Bos-Kaihara-Kleinjung-Lenstra-Montgomery oppose NIST's transition to RSA-2048.

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Enough theory+experiment should reach consensus on amount of computation required to break a system.

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But can the attacker perform this amount of computation?

Hypothesize attacker resources.

This talk: \$2 billion, 65MW.

Alternative: millions of compromised Internet computers.

The interesting part: analyze optimal use of those resources.

#### Communication vs. arithmetic

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Depends what you're doing!

Computations fundamentally vary in amount of communication (distance and volume) and amount of arithmetic.

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Integrals in quantum chemistry, many common iterations, graph algorithms, etc.:  $n^4$  arithmetic, sometimes more.

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1981 Brent–Kung: need  $n^{1+\epsilon}$  even without wire delays.

Chip area  $n^{2+\epsilon}$  is enough to store several  $n \times n$  matrices.

Routing matrix product occupies area  $n^{2+\epsilon}$  for time  $n^{1+\epsilon}$ .

Typical  $n^3$  arithmetic also occupies  $n^2$  ALUs for time  $n^{1+\epsilon}$ .

Closer look at  $\epsilon$ : the ALU cost dominates, although not by much.

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Doubling number of ALUs would cost <10% extra. Would  $\approx$ double performance of matrix-matrix product and heavier-arith computations.

NSA's computations have a mix of heavy arith and heavy comm.

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Adding communication
between adjacent ALUs
would cost very little.
Would drastically speed up
matrix-matrix product
and heavier-comm computations:
FFT, sorting, etc.

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Adding two-dimensional grid would drastically speed up heavy-comm computations. e.g. 1977 Thompson–Kung.

Grid examples: MasPar; FPGAs. But FPGAs have other problems.

Save even more time with 3D arrangement of ALUs? e.g. 1983 Rosenberg.

Huge engineering challenge.

2D allows easy scaling of energy input, heat output up to very large chip area. 3D is hard to scale.

Some limited progress (most interesting: optics), presumably used by NSA. Progress often exaggerated: e.g.,  $4 \times 16384 \times 16384$  is often called "3D".

## Special vs. general purpose

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Some exceptions, but overall ASICs bring massive speedup.

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Only in cryptanalysis? No. Estimated ASIC improvement from preliminary scan of other supercomputing arith problems: usually  $>10\times$ , often  $>100\times$ .

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⇒ CPU/GPU design trend: reduce insn-handling cost by adding vectorization—apply same instruction to multiple data/threads.

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But this does nothing to reduce costs of reading data from reg file, writing data to reg file.

Obvious strategy to reduce these reg costs: combine arith operations, doing more arith between read and write.

Example: Build circuit to compute xy + z.

CPU reads regs x, y, z; computes xy + z; writes.

With separate mul, add: CPU reads x, y; computes xy; writes; reads back; reads z; computes xy + z; writes. Common fp operations evolved in this way.

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Then spent much more area to expand the multiplier to double-precision fp.

But people still run many single-precision computations. The multiplier transistors are **mostly sitting idle**.

Another example:
Your application does
mul-sub-sub-sub-sub
in its inner loop.

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CPU designer says no, reduces area per core.

⇒ Your application runs slowly.

# Many ASIC fp speedups beyond today's CPUs/GPUs:

- Squaring is cheaper than multiplication.
- Skip most normalizations.
- Reduce precision to what is actually needed.
- Add very fast sqrt if application needs it.
- etc.

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Cryptanalysis involves
many multiplications
but also a much wider
variety of operations.
Even larger ASIC speedups.

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The big problem:
Unpredictable application mix.
NSA will want some agility
to adapt to new computations
and stop old computations.

Quantify using historical data: how long is an ASIC useful?

Obvious solution for NSA: some ASICs, plus heterogeneous mix of **application-tuned** integrated circuits (ATICs).

Take a general-purpose CPU.

Add exactly the big insn

XYZZY needed by application,
plus some vectorization.

Think ahead, add agility:

XYZZ? XZZY? XYQZZY?

Still similar cost to ASIC.

New CPU for each application. Merge similar applications if not much cost in area.

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Need to understand cryptanalysis: ECM, sparse linear algebra, differentials, FFTs, much more.