High-speed cryptography,
part 4:
fast multiplication
and its applications
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Survey paper:
cr.yp.to/papers.html\#multapps

Integer-factorization bottleneck:
Given sequence of numbers,
find nonempty subsequence with square product.
e.g. given $6,7,8,10,15$,
discover $6 \cdot 10 \cdot 15=30^{2}$.
Discrete-log bottleneck:
Given sequence of numbers,
find 1 as nontrivial
product of powers.
e.g. given $6,7,8,10,15$,
discover $6^{3} 7^{0} 8^{-2} 10^{3} 15^{-3}=1$.
More generally: find $k$ th power.

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cryptographic bottlenecks:
Multiply large polynomials; multiply large integers.

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Do real applications reach large enough sizes to benefit from these techniques? In cryptanalysis, definitely. In cryptography, sometimes:
Gaudry-Schost Kummer surface; McBits; many more examples.

## The fast Fourier transform

Use $\left(c_{0}, c_{1}, \ldots, c_{n-1}\right) \in \mathbf{C}^{n}$
to represent $f=\sum_{j} c_{j} x^{j} \in \mathbf{C}[x]$.
Summary of representation size:
" $f$ has $n$ coeffs". Warning:
$f$ does not determine $n$.
$f=f_{0}\left(x^{2}\right)+x f_{1}\left(x^{2}\right)$ where
$\left(c_{0}, c_{2}, \ldots\right) \in \mathbf{C}^{\lceil n / 2\rceil}$,
$\left(c_{1}, c_{3}, \ldots\right) \in \mathbf{C}^{\lfloor n / 2\rfloor}$
represent $f_{0}, f_{1}$ respectively.
$\mathrm{C}[x]$-morphism $y \mapsto x^{2}$
from $\mathbf{C}[x][y]$ to $\mathbf{C}[x]$
maps $f_{0}(y)+x f_{1}(y)$ to $f$.

Quickly evaluate $f(\alpha), f(-\alpha)$ by evaluating $f_{0}\left(\alpha^{2}\right) ; f_{1}\left(\alpha^{2}\right)$; $f(\alpha)=f_{0}\left(\alpha^{2}\right)+\alpha f_{1}\left(\alpha^{2}\right) ;$
$f(-\alpha)=f_{0}\left(\alpha^{2}\right)-\alpha f_{1}\left(\alpha^{2}\right)$.
Evaluate $f(\alpha)$ for, e.g., all $\alpha \in \mathbf{C}$ with $\alpha^{1024}=1$ by evaluating $f_{0}(\beta), f_{1}(\beta)$ for all $\beta \in \mathbf{C}$ with $\beta^{512}=1$; plus 1024 adds, 512 mults.

Apply this recursively $\Rightarrow$ $n \lg n$ adds, $(n / 2) \lg n$ mults to evaluate $n$-coeff $f$
for all $\alpha \in \mathbf{C}$ with $\alpha^{n}=1$ if $n$ is a power of 2 .

## Another view of the FFT

If $f \in \mathbf{C}[x]$ and
$f \bmod x^{4}-1=$
$c_{0}+c_{1} x+c_{2} x^{2}+c_{3} x^{3}$ then
$f \bmod x^{2}-1=$
$\left(c_{0}+c_{2}\right)+\left(c_{1}+c_{3}\right) x$,
$f \bmod x^{2}+1=$
$\left(c_{0}-c_{2}\right)+\left(c_{1}-c_{3}\right) x$.
$\mathrm{C}[x]$-morphism $\mathrm{C}[x] /\left(x^{4}-1\right) \hookrightarrow$
$\mathrm{C}[x] /\left(x^{2}-1\right) \oplus \mathbf{C}[x] /\left(x^{2}+1\right)$
maps $c_{0}+c_{1} x+c_{2} x^{2}+c_{3} x^{3}$ to
$\left(\left(c_{0}+c_{2}\right)+\left(c_{1}+c_{3}\right) x\right.$,
$\left.\left(c_{0}-c_{2}\right)+\left(c_{1}-c_{3}\right) x\right)$.

If $f \in \mathbf{C}[x]$ and
$f \bmod x^{2 n}-\alpha^{2}=$
$c_{0}+c_{1} x+\cdots+c_{2 n-1} x^{2 n-1}$ then
$f \bmod x^{n}-\alpha=$
$\left(c_{0}+\alpha c_{n}\right)+\left(c_{1}+\alpha c_{n+1}\right) x$ $+\left(c_{2}+\alpha c_{n+2}\right) x^{2}+\cdots$,
$f \bmod x^{n}+\alpha=$
$\left(c_{0}-\alpha c_{n}\right)+\left(c_{1}-\alpha c_{n+1}\right) x$ $+\left(c_{2}-\alpha c_{n+2}\right) x^{2}+\cdots$.

Given $c_{0}, c_{1}, \ldots, c_{2 n-1} \in \mathbf{C}$, use $n$ muts, $2 n$ adds to compute
$c_{0}+\alpha c_{n}, c_{1}+\alpha c_{n+1}, \ldots$,
$c_{0}-\alpha c_{n}, c_{1}-\alpha c_{n+1}, \ldots$

Apply this recursively:
$f \bmod x^{4}-1$

$f \bmod x^{2}-1$
$f \bmod x^{2}+1$

$f \bmod f \bmod \quad f \bmod \quad f \bmod$
$x-1 \quad x+1 \quad x-i \quad x+i$ $\begin{array}{cccc}= & = & = & = \\ f(1) & f(-1) & f(i) & f(-i)\end{array}$
(basic FFT idea: 1866 Gauss; this view: 1972 Fiduccia)

1966 Sande, 1966 Stockham:
Can very quickly multiply
in $\mathbf{C}[x] /\left(x^{n}-1\right)$ or $\mathbf{C}[x]$ or $\mathbf{R}[x]$
by mapping $\mathbf{C}[x] /\left(x^{n}-1\right)$ to $\mathbf{C}^{n}$.
Given $f, g \in \mathbf{C}[x] /\left(x^{n}-1\right)$ :
compute $f g$ as $T^{-1}(T(f) T(g))$
using $T: \mathbf{C}[x] /\left(x^{n}-1\right) \hookrightarrow \mathbf{C}^{n}$.
Compute $T$ quickly by the FFT.
Given $f, g \in \mathbf{C}[x], \operatorname{deg} f g<n$ : compute $f g$ from
its image in $\mathbf{C}[x] /\left(x^{n}-1\right)$.

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Compute $T$ quickly by the FFT.
Given $f, g \in \mathbf{C}[x], \operatorname{deg} f g<n$ : compute $f g$ from its image in $\mathbf{C}[x] /\left(x^{n}-1\right)$. Later authors: Replace $\mathbf{C}$ with, egg., $R=\mathbf{Z} /\left(3 \cdot 2^{41}+1\right)$; 23 has order $2^{41}$ in $R^{*}$.

## Multiplication and division

Given $r, s \in \mathbf{Z}$, can compute $r s$ in time $\leq b(\lg b)^{1+o(1)}$ where $b$ is number of input bits.
(1971 Pollard; independently
1971 Nicholson; independently
1971 Schönhage Strassen)
Also time $\leq b(\lg b)^{1+o(1)}$
where $b$ is number of input bits:
Given $r, s \in \mathbf{Z}$ with $s \neq 0$, compute $\lfloor r / s\rfloor$ and $r \bmod s$.
(reduction to product:
1966 Cook)

## Product trees

Time $\leq b(\lg b)^{2+o(1)}$
where $b$ is number of input bits:
Given $x_{1}, x_{2}, \ldots, x_{n} \in \mathbf{Z}$,
compute $x_{1} x_{2} \cdots x_{n}$.
Actually compute
product tree of $x_{1}, x_{2}, \ldots, x_{n}$.
Root is $x_{1} x_{2} \cdots x_{n}$.
Has left subtree if $n \geq 2$ :
product tree of $x_{1}, \ldots, x_{\lceil n / 2\rceil}$.
Also right subtree if $n \geq 2$ :
product tree of $x_{\lceil n / 2\rceil+1}, \ldots, x_{n}$.
e.g. tree for $23,29,84,15,58,19$ :


Tree has $\leq(\lg b)^{1+o(1)}$ levels. Each level has $\leq b(\lg b)^{0+o(1)}$ bits.

Obtain each level
in time $\leq b(\lg b)^{1+o(1)}$
by multiplying lower-level pairs.

## Remainder trees

Remainder tree
of $r, x_{1}, x_{2}, \ldots, x_{n}$ has
one node $r \bmod t$ for each node $t$
in product tree of $x_{1}, x_{2}, \ldots, x_{n}$. e.g. remainder tree of 223092870, 23, 29, 84, 15, 58, 19:


Time $\leq b(\lg b)^{2+o(1)}:$
Given $r \in \mathbf{Z}$ and
nonzero $x_{1}, \ldots, x_{n} \in \mathbf{Z}$,
compute remainder tree of $r, x_{1}, \ldots, x_{n}$.

In particular, compute $r \bmod x_{1}, \ldots, r \bmod x_{n}$.

In particular, see which of $x_{1}, \ldots, x_{n}$ divide $r$.
(1972 Moenck Borodin, for "single precision" $x_{i}$ 's, whatever exactly that means)

## Small primes, union

Time $\leq b(\lg b)^{2+o(1)}:$
Given $x_{1}, x_{2}, \ldots, x_{n} \in \mathbf{Z}$ and
finite set $Q \subseteq \mathbf{Z}-\{0\}$, compute
$\left\{p \in Q: x_{1} x_{2} \cdots x_{n} \bmod p=0\right\}$.
In particular, when $p$ is prime, see whether $p$ divides any of $x_{1}, x_{2}, \ldots, x_{n}$.

Algorithm:

1. Use a product tree to
compute $r=x_{1} x_{2} \cdots x_{n}$.
2. Use a remainder tree to see which $p \in Q$ divide $r$.

Small primes, separately
Time $\leq b(\lg b)^{3+o(1)}$ :
Given $x_{1}, x_{2}, \ldots, x_{n} \in \mathbf{Z}$ and
finite set $Q$ of primes,
compute $\left\{p \in Q: x_{1} \bmod p=0\right\}$,
$\ldots,\left\{p \in Q: x_{n} \bmod p=0\right\}$.
(2000 Bernstein)
Algorithm for $n \geq 1$ :

1. Replace $Q$ with
$\left\{p \in Q: x_{1} \cdots x_{n} \bmod p=0\right\}$.
2. If $n=1$, print $Q$ and stop.
3. Recurs on $x_{1}, \ldots, x_{\lceil n / 2\rceil}, Q$.
4. Recurse on $x_{\lceil n / 2\rceil+1}, \ldots, x_{n}, Q$.

$$
\begin{aligned}
& \text { Factor 2543, 6766, 8967, } 7598 \\
& \operatorname{over}\{\underline{2}, \underline{3}, 5, \underline{7}, 11,13, \underline{17}\} \\
& \text { 2543, } 6766 \\
& \text { over } \\
& \underline{2}, 3,7, \underline{17} \\
& \text { 8967,7598 } \\
& \text { over } \\
& \text { 2, } \underline{3}, \underline{7}, 17 \\
& 2543 \\
& 6766 \\
& 8967 \\
& 7598 \\
& \text { over } \\
& \text { over } \\
& \text { over } \\
& \text { over } \\
& \text { 2, } 17 \\
& \text { 2, } 17 \\
& \text { 2, } \underline{3}, \underline{7} \\
& \text { 2, 3, } 7
\end{aligned}
$$

Each level has $\leq b(\lg b)^{0+o(1)}$ bits.

## Exponents of a small prime

Time $\leq b(\lg b)^{2+o(1)}:$
Given nonzero $p, x \in \mathbf{Z}$,
find $e, p^{e}, x / p^{e}$ with maximal $e$.
Algorithm:

1. If $x \bmod p \neq 0$ :

Print $0,1, x$ and stop.
2. Find $f,\left(p^{2}\right)^{f}, r=(x / p) /\left(p^{2}\right)^{f}$ with maximal $f$.
3. If $r \bmod p=0$ : Print $2 f+2,\left(p^{2}\right)^{f} p^{2}, r / p$ and stop.
4. Print $2 f+1,\left(p^{2}\right)^{f} p, r$.

## Exponents of small primes

Time $\leq b(\lg b)^{3+o(1)}$ :
Given finite set $Q$ of primes and nonzero $x \in \mathbf{Z}$, find maximal $e, \prod_{p \in Q} p^{e(p)}, x / \prod_{p \in Q} p^{e(p)}$.

Algorithm:

1. Replace $Q$ with
$\{p \in Q: x \bmod p=0\}$.
2. Find maximal $f, s, r$ with $s=\Pi\left(p^{2}\right)^{f\left(p^{2}\right)}, r=(x / \Pi p) / s$.
3. Find $T=\{p \in Q: r \bmod p=0\}$.
4. Output $e, s \prod_{p \in T} p, r / \prod_{p \in T} p$ where $e(p)=2 f\left(p^{2}\right)+[p \in T]$.

Smooth parts, old approach
Time $\leq b(\lg b)^{3+o(1)}:$
Given nonzero $x_{1}, x_{2}, \ldots, x_{n} \in \mathbf{Z}$ and finite set $Q$ of primes,
compute $Q$-smooth part of $x_{1}$,
$Q$-smooth part of $x_{2}, \ldots$,
$Q$-smooth part of $x_{n}$.
$Q$-smooth means product of powers of elements of $Q$.
$Q$-smooth part means
largest $Q$-smooth divisor.
In particular, see which of $x_{1}, x_{2}, \ldots, x_{n}$ are smooth.

Algorithm:

1. Find $Q_{1}=\left\{p: x_{1} \bmod p=0\right\}$,
$\ldots, Q_{n}=\left\{p: x_{n} \bmod p=0\right\}$.
2. For each $i$ separately:

Find maximal $e, s, r$ with $s=\prod_{p \in Q_{i}} p^{e(p)}, r=x_{i} / s$. Print $s$.
e.g. factor $2543,6766,8967,7598$
over $\{2,3,5,7,11,13,17\}$ :
2543 over $\}$, smooth part 1 ;
6766 over $\{2,17\}$, smooth part 34 ; 8967 over $\{3,7\}$, smooth part 147; 7598 over $\{2\}$, smooth part 2.

Smooth multiplicative dependencies
Recall cryptanalytic bottleneck:
find $k$ th power nontrivially as product of powers of $x_{1}, x_{2}, \ldots, x_{n}$.

Choose $y$; imagine $y=2^{40}$.
Define $Q$ as set of primes $\leq y$.
See which of $x_{1}, x_{2}, \ldots, x_{n}$
are $y$-smooth, ie., $Q$-smooth.
Know their factorizations.
Do linear algebra over $\mathbf{Z} / k$ on the exponent vectors.

Smooth parts, new approach
Given nonzero $x_{1}, x_{2}, \ldots, x_{n} \in \mathbf{Z}$ and finite set $Q$ of primes:
Time typically $\leq b(\lg b)^{2+o(1)}$
to obtain smooth parts of $x$ 's.
(2004 Frank Kleinjung
Morain Wirth, in ECPP context)
Algorithm:
Compute $r=\prod_{p \in Q} p$.
Compute $r \bmod x_{1}, \ldots, r \bmod x_{n}$.
For each $i$ separately:
Replace $x_{i}$ by
$x_{i} / \operatorname{gcd}\left\{x_{i}, r \bmod x_{i}\right\}$ repeatedly until god is 1 .

Slight variant (2004 Bernstein): Time always $\leq b(\lg b)^{2+o(1)}$.

Compute smooth part of $x_{i}$ as $\operatorname{gcd}\left\{x_{i},\left(r \bmod x_{i}\right)^{2^{k}} \bmod x_{i}\right\}$ where $k=\left\lceil\lg \lg x_{i}\right\rceil$.

Subroutine: Computing ged takes time $\leq b(\lg b)^{2+o(1)}$.
(1971 Schönhage;
core idea: 1938 Lehmer; $b(\lg b)^{5+o(1)}: 1971$ Knuth $)$

Or, to see if $x_{i}$ is smooth, see if $\left(r \bmod x_{i}\right)^{2^{k}} \bmod x_{i}=0$.

Minor problem: New algorithm finds the smooth numbers but doesn't factor them.

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Solution:
Feed the smooth numbers to the old algorithm.
Very few smooth numbers, so this is very fast.

Bottom line for cryptanalysis:
time per input number to
find and factor smooth numbers
has dropped by $(\lg b)^{1+o(1)}$.

## Is smooth the right question?

After finding smooth numbers, do first step of linear algebra:
Throw away primes that appear only once; throw away numbers with those primes; repeat until stable.

Don't want all smooth numbers.
Want smooth numbers only if they are built from primes that divide the other numbers.

## An alternate approach

Given nonzero $x_{1}, x_{2}, \ldots, x_{n} \in \mathbf{Z}$ :
Compute $r=x_{1} x_{2} \cdots x_{n}$.
Compute $\left(r / x_{1}\right) \bmod x_{1}, \ldots$,
$\left(r / x_{n}\right) \bmod x_{n}$.
For each $i$ separately: see if
$\left(\left(r / x_{i}\right) \bmod x_{i}\right)^{2^{k}} \bmod x_{i}=0$
where $k=\left\lceil\lg \lg x_{i}\right\rceil$.
Finds $x_{i}$ iff all primes in $x_{i}$ are divisors of other $x$ 's. Time $\leq b(\lg b)^{2+o(1)}$.
(2004 Bernstein)

Compute $\left(r / x_{1}\right) \bmod x_{1}, \ldots$, $\left(r / x_{n}\right) \bmod x_{n}$ by computing $r \bmod x_{1}^{2}, \ldots, r \bmod x_{n}^{2}$. (1972 Moenck Borodin)

Compute $\left(r / x_{1}\right) \bmod x_{1}, \ldots$, $\left(r / x_{n}\right) \bmod x_{n}$ by computing $r \bmod x_{1}^{2}, \ldots, r \bmod x_{n}^{2}$. (1972 Moenck Borodin)

Problem: Recognizing the interesting $x$ 's is not enough; also need their factorizations.

Compute $\left(r / x_{1}\right) \bmod x_{1}, \ldots$, $\left(r / x_{n}\right) \bmod x_{n}$ by computing $r \bmod x_{1}^{2}, \ldots, r \bmod x_{n}^{2}$. (1972 Moenck Borodin)

Problem: Recognizing the interesting $x$ 's is not enough; also need their factorizations.

## Solution:

Again, very few of them. Have ample time to use rho method (1974 Pollard) or use ECM (1987 Lenstra) or factor into coprimes.

## Factoring into coprimes

Time $\leq b(\lg b)^{O(1)}$ :
Given positive $x_{1}, x_{2}, \ldots, x_{n}$, find coprime set $Q$ and complete factorization of each $x_{i}$ over $Q$.
(announced 1995 Bernstein; journal version: 2005)

Immediately gives $b(\lg b)^{O(1)}$
for the other factoring problems.
Subsequent research: Ig speedups, constant-factor speedups, etc.

## Typical application:

detecting multiplicative relations.
Does $91^{1952681} 119^{1513335} 221^{634643}$
equal $1547^{1708632} 6898073^{439346}$ ?
Each side has logarithm $\approx 19466590.674872$.

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More generally:
What is kernel of $(a, b, c, d, e) \mapsto$ $91^{a} 119^{b} 221^{c} 1547^{-d} 6898073^{-e}$ ?

Kernel lets us find relations, not just verify relations.

Factor into coprimes:
$91=7 \cdot 13 ; 119=7 \cdot 17$;
$221=13 \cdot 17 ; 1547=7 \cdot 13 \cdot 17$; $6898073=7^{4} \cdot 13^{2} \cdot 17$.
$(a, b, c, d, e) \mapsto$
$91^{a} 119^{b} 221^{c} 1547^{-d} 6898073^{-e}=$
$7^{a+b-d-4 e} 13^{a+c-d-2 e} 17^{b+c-d-e}$.
Kernel is generated by
$(1,1,1,2,0)$ and (3, 2, 0, 1, 1).

Factor into coprimes:
$91=7 \cdot 13 ; 119=7 \cdot 17$;
$221=13 \cdot 17 ; 1547=7 \cdot 13 \cdot 17$;
$6898073=7^{4} \cdot 13^{2} \cdot 17$.
$(a, b, c, d, e) \mapsto$
$91^{a} 119^{b} 221^{c} 1547^{-d} 6898073^{-e}=$
$7^{a+b-d-4 e} 13^{a+c-d-2 e} 17^{b+c-d-e}$.
Kernel is generated by
$(1,1,1,2,0)$ and ( $3,2,0,1,1$ ).
Factoring into coprimes remains fast for larger numbers.
Factoring into primes does not.

Can apply same algorithms
in more generality: e.g., replace integers with polynomials.

Typical application:
Take a squarefree $g \in(\mathbf{Z} / 2)[x]$.
What are $g$ 's irreducible divisors?
One answer: Find basis $h_{1}, h_{2}, \ldots$ for $\left\{h \in(\mathbf{Z} / 2)[x]:(g h)^{\prime}=h^{2}\right\}$ as a vector space over $\mathbf{Z} / 2$.
Factor $g, h_{1}, h_{2}, \ldots$ into coprimes.
This list of coprimes contains all irreducible divisors of $g$.
(1993 Niederreiter, 1994 Göttfert)

More examples, applications of factoring into coprimes: see 1890 Stieltjes; 1974 Collins; 1985 Kaltofen; 1985 Della
Dora DiCrescenzo Duval; 1986
Bach Miller Shallit; 1986 von zur Gathen; 1986 Lüneburg; 1989 Pohst Zassenhaus; 1990 Teitelbaum; 1990 Smedley; 1993 Bach Driscoll Shallit; 1994 Ge; 1994 Buchmann Lenstra; 1996 Bernstein; 1997 Silverman; 1998 Cohen Diaz y Diaz Olivier; 1998 Storjohann; ... cr.yp.to/coprimes.html

Exercise: Given $2^{23}$ RSA keys,
how would you check for primes shared among those keys?

2012 Heninger-Durumeric-
Wustrow-Halderman,
best-paper award at
USENIX Security Symposium;
2012 Lenstra-Hughes-Augier-
Bos-Kleinjung-Wachter, independent "Ron was wrong, Whit is right" paper, Crypto:

RSA keys on the Internet use such bad randomness that this does find factors!

