## XOR for Fun and Profit From L1 Cache to Algebraic Cryptanalysis

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#### Outline

XOR and  $\mathbb{F}_2$ 

Words, Loops, Cache & SSE2

Linear and Polynomial Systems of Equations

Algebraic Cryptanalysis

Final



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#### XOR and $\mathbb{F}_2$

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- ► Field with two elements.
- ► XOR is addition.
- ► AND is multiplication.
- It doesn't get any easier than that.
- ► This is why it's hard.

		$\oplus$	$\odot$
0	0	0	0
0	1	1	0
1	0	1	0
1	1	0	1

# I suspect most of the stuff in this presentation to be correct, but I realised several times during this week that my theories are false and had to update these slides.

#### Gaussian Reduction

# M4RI [2]: Idea



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M4RI [2]: Gray Codes



 Computing all possible 2<sup>k</sup> sums, costs only 2<sup>k</sup> additions.

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# M4RI [2]: Algorithm

```
while c<ncols:
  if c+k > A.ncols():
    k = ncols - c
  kbar = A.gauss_submatrix(r, c, k, nrows)
  if kbar > 0:
   T = A.make_table(r, c, kbar)
   # add rows from table T
   <u>A.add_rows(0, r, c, kbar, T)</u>
   A.add_rows(r+kbar, nrows, c, kbar, T)
  r += kbar
  c += kbar
  if k!=kbar:
    c++
```

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## class M4RI(M4RM):

- M4RI inspired by "Method of the Four Russians" multiplication (M4RM) or Kronrod's method.
- ► Complexity of both algorithms: O(n<sup>3</sup>/log<sub>2</sub>(n)) memory accesses.

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 $O(n^{2.807})$  matrix elimination was planned for this workshop, but we're not there yet.

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#### Words

- ▶ Modern CPUs have 64-bit words  $\rightarrow$  operate on 64  $\mathbb{F}_2$  elements in parallel.
- Every operation on single bits is a waste of time, to be avoided at all costs.

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 Even our naive cubic multiplication doesn't do that, thanks to David Harvey.

#### Dot Product

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#### XOR is Cheap, Loops are Expensive

```
for (i=0; i<2048; i++) {
   dst[i] ^= src[i];
}</pre>
```

488b04d3 (%rbx,%rdx,8),%rax 400567: mov xor %rax,0x0(%rbp,%rdx,8) 40056b: 483144d500 400570: 4883c201 add \$0x1.%rdx \$0x800,%rdx 400574: 4881fa00080000 cmp 40057b: 400567 <main+0x2f> 75ea ine

Don't take this example too seriously, your compiler is your friend, don't try to outsmart it: It will outsmart you and unroll loops on the way.

#### Loops cont.

If the loop unrolling of the compiler doesn't satisfy you:

- ► Unroll it yourself. ATLAS unrolls up to 32.
- http://en.wikipedia.org/wiki/Duff's\_device
- ► Do more stuff per iteration, e.g.:

# Cache [3] I



Memory Regs L1L2 Ram Swap  $10^{2}$ Speed (ns)  $10^{7}$ 0.5 2 6  $2 \cdot 10^{7}$ Cost (cycles) 200 1 4 14 Size 4 · 64-bit 64k 1-4M 1G 100G

# Cache [3] II

"Therefore, we propose that matrix entry reads and writes be tabulated, because addition (XOR) and multiplication (AND) are single instructions, while reads and writes on rectangular arrays are much more expensive. Clearly these data structures are nontrivial in size (hundreds of megabytes at the least) and so memory transactions will be the bulk of the computational burden."

— Gregory Bard, [2]

## Cache Efficiency: *n* Gray Code Tables (Bill Hart)



Example: M4RM n = 8, k = 5 and size = 2048:  $n \cdot 2^k \cdot 2048/8 = 64k$  (= L1 on Opterons).

#### Cache Efficiency: Matrix Block'ing

 For M4RM we can block the source matrices to gain better cache efficiency

$$\left(\begin{array}{cc} AE & AF \\ CE & CF \end{array}\right) = \left(\begin{array}{cc} A \\ C \end{array}\right) \cdot \left(\begin{array}{cc} E & F \end{array}\right).$$

- ► My attempts for M4RI failed.
- However, we will inherit block'ing from M4RM eventually.

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 Of course, Strassen's formula comes with block matrix decomposition.

#### Vectorisation I

Modern compilers (GCC 4, MSVC, SunCC) support 128-bit SSE2 integer instructions via compiler intrinsics.

This gives up to 25% speed improvement on the Intel Core2Duo, it seems slower on the AMD Opteron.

#### Vectorisation II

Alternatively, GCC has custom vectorisation support across all platforms (SSE, AltiVec, ...) I haven't tried that yet.

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http://gcc.gnu.org/onlinedocs/gcc/ Vector-Extensions.html

#### Results: Multiplication I

- Strassen-Winograd O(n<sup>2.807</sup>) multiplication with memory efficient scheduling [9].
- M4RM as base case, cutoff:  $\frac{2n^2}{8} = L2$ .
- ► 64-bit bulk operations on AMD CPUs.
- ▶ 128-bit SSE2 bulk operations on Intel CPUs.
- ► 8 Gray code tables.
- Matrix block decomposition in M4RM.

Even with all that, we are not there yet. But there are some ideas in the pipeline.

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#### Results: Multiplication II



Figure: 2.6 Ghz Opteron, 18GB RAM, VMWare Virtualised

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#### Results: Multiplication III



Figure: "Gbops"  $(2 \cdot n^3/(10^9 \cdot t))$  on Core2Duo

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#### Parallelisation

```
#pragma omp parallel sections
#pragma omp section
_mzd_mul_mp(Q0, A00, B00, cut);
#pragma omp section
<u>_mzd_mul_mp(Q1, A01, B10, cut);</u>
```

"The **OpenMP** API supports multi-platform shared-memory parallel programming in C/C++ ... It is a portable, scalable model ... on platforms from the desktop to the supercomputer."

#### Intermediate Results: OpenMP



#### Figure: 2.33 Ghz Core2Duo, 3GB RAM

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#### Results: Reduced Row Echelon Form I

- M4RI  $O(n^3/log_2(n))$  reduction.
- ▶ 64-bit bulk operations.
- ► 4 Gray code tables.

#### This is not asymptotically fast!

#### Results: Reduced Row Echelon Form II



Figure: 2.6 Ghz Opteron, 18GB RAM, VMWare Virtualised

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#### Results: Reduced Row Echelon Form III



Figure: 2.33 Ghz Core2Duo, 3GB RAM

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#### Linear Systems

Consider for example a linear system of equations over  $\mathbb{F}_{127}[x, y, z]$ .

$$0 = 26y + 52z + 62$$

$$0 = 54y + 119z + 55$$

$$0 = 41x + 91z + 13$$

$$\begin{pmatrix} 0 & 26 & 52 & 62 \\ 0 & 54 & 119 & 55 \\ 41 & 0 & 91 & 13 \end{pmatrix}$$

$$0 = x + 29$$

$$0 = y + 38$$

$$0 = z + 75$$

$$\begin{pmatrix} 1 & 0 & 0 & 29 \\ 0 & 1 & 0 & 38 \\ 0 & 0 & 1 & 75 \end{pmatrix}$$

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#### **Polynomial Division**

Now consider two polynomials in  $\mathbb{F}_{127}[x, y, z]$  with term ordering **degrevlex**.

$$\begin{aligned} f &= x^2 + 2xy - 2y^2 + 14z^2 + 22z \\ g &= xy + y^2 + z^2 + x + 2z \end{aligned} \qquad \left( \begin{array}{cccccccc} 1 & 2 & -2 & 14 & 0 & 22 \\ 0 & 1 & 1 & 1 & 1 & 2 \end{array} \right) \end{aligned}$$

$$\begin{array}{cccc} f' = x^2 - 4y^2 + 12z^2 - 2x + 18z \\ g = xy + y^2 + z^2 + x + 2z \end{array} & \left( \begin{array}{ccccc} 1 & 0 & -4 & 12 & 125 & 18 \\ 0 & 1 & 1 & 1 & 1 & 2 \end{array} \right)$$

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#### Polynomial Division cont. I

This approach fails for

$$f = x^{2} - 2xy - 2y^{2} + 14z^{2},$$
  
$$g = y + x + 2z.$$

since y is not a monomial of f. However, it divides two monomials of f:  $y^2$  and xy. To deal with these include multiples of  $m \cdot g$  such that

$$LM(m \cdot g) = m \cdot LM(g) \in M(f).$$

## Polynomial Division cont. II

 $\begin{array}{l} 0 = x^2 + 4yz + 14z^2, \\ 0 = xy + 2xz + -4yz - \dots, \\ 0 = y^2 - 2xz + 6yz + \dots, \\ 0 = x + y + 2z \end{array} \begin{pmatrix} 1 & 0 & 0 & 0 & \dots & 0 & \dots \\ 0 & 1 & 0 & 2 & \dots & 0 & \dots \\ 0 & 0 & 1 & -2 & \dots & 0 & \dots \\ 0 & 0 & 0 & 0 & \dots & 1 & \dots \end{pmatrix}$ 

Lets call the whole process inter-reduction.

## Solving Polynomial Systems of Equations

- ► Inter-reduction alone is not sufficient for systems with degree d > 1.
- Iteration of multiplication & inter-reduction steps:
  - Multiplication can either be naive (XL [8] and variants) or
  - ▶ more careful (Buchberger, F<sub>4</sub> [10], SlimGB [4]) and
  - up to optimal in some situations  $(F_5 [11])$ .
- After a finite number of steps, we end up with an "easy" system of equations to read the solution from.
- ► ... I didn't use the word **Gröbner basis** once.

Expensive step is reduction  $\rightarrow$  linear algebra.



Figure: The shape of the initial matrix is "similar" to triangular.

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## Substitution Permutation Network



# Consider the (exceptionally bad) S-Box

 $\left[4,1,2,3,0,5,6,7\right]$ 

as an example.

Construct the matrix on the right and perform fraction-free Gaussian elimination on it.

(	1	1	1	1	1	1	1	1	1
	0	0	0	0	1	1	1	1	x <sub>0</sub>
	0	0	1	1	0	0	1	1	$x_1$
	0	1	0	1	0	1	0	1	<i>x</i> <sub>2</sub>
	1	0	0	0	0	1	1	1	У0
	0	0	1	1	0	0	1	1	$y_1$
	0	1	0	1	0	1	0	1	<i>y</i> 2
	0	0	0	0	0	0	1	1	$x_0 x_1$
	0	0	0	0	0	1	0	1	<i>x</i> <sub>0</sub> <i>x</i> <sub>2</sub>
	0	0	0	0	0	1	1	1	<i>x</i> <sub>0</sub> <i>y</i> <sub>0</sub>
	0	0	0	0	0	0	1	1	$x_0 y_1$
	0	0	0	0	0	1	0	1	<i>x</i> <sub>0</sub> <i>y</i> <sub>2</sub>
	0	0	0	1	0	0	0	1	$x_1y_2$
	0	0	0	0	0	1	0	1	$x_2 y_0$
	0	0	0	1	0	0	0	1	$x_2 y_1$
	0	1	0	1	0	1	0	1	<i>x</i> <sub>2</sub> <i>y</i> <sub>2</sub>
	0	0	0	0	0	0	1	1	<i>y</i> 0 <i>y</i> 1
	0	0	0	0	0	1	0	1	<i>Y</i> 0 <i>Y</i> 2
	0	0	0	1	0	0	0	1	<i>Y</i> 1 <i>Y</i> 2 /

#### S-Box Equations II

 $x_0 y_0 + y_0$  $x_0x_1 + x_0y_0 + x_0 + x_1 + y_0 + 1$  $\mathbf{1}$  $x_0x_2 + x_0y_0 + x_0 + x_2 + y_0 + 1$  $x_0x_1 + x_0x_2 + x_0y_0 + x_0 + x_1 + x_2 + y_0 + 1$  $x_0 y_0 + x_0$  $x_0 x_1 + x_0 y_0$  $x_0x_2 + x_0y_0$  $x_0x_1 + x_0x_2 + x_0y_0$  $x_0x_2 + y_0y_2$ 

## Cipher Equations

- Define subkey variables for the subkey bits used in each round.
- ► Define "state" variables for S-Box input and output bits.
- Diffusion layer is linear in these variables and the subkey variables.
- ► Define equations for key schedule analogously.

There are many ways the above can be done. How it is done most effectively, is an open research problem.

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#### Performance

	PolyBoRi [5]	MRHS [12]	ElimLin [6]	MiniSat [6]
CPU	2.2 GHZ	?	1.6 Ghz	1.6 Ghz
RAM	16 GB	1 GB	?	?
SR(4,1,1,4)	—	0.032 s	—	—
SR(10,1,1,4)	0.14 s	0.32 s	_	_
SR(10,1,2,4)	6.7 s	_	_	_
SR(10,2,2,4)	1205 s	_	_	
4r DES	_	_	2 <sup>19</sup> · 8 s	_
5r DES	—	—	$2^{23} \cdot 173 s$	—
6r DES	—	—	_	2 <sup>20</sup> · 68 s

#### Algebraic and "Conventional" Attacks

KeeLoq 32-bit blocksize, 64-bit keysize, 528 very simple rounds. Attack combining algebraic and slide attacks breaks the cipher [7]. There are better attacks though.

PRESENT 64-bit blocksize, 128-bit keysize, 31 round ciphers. Technique combining algebraic and differential (more **XOR**!) attacks breaks 18 rounds [1].

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Having said that: However, for many problems, what we really need is reduction of sparse matrices.

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#### Thank You!



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