

# Fast Exhaustive Search for Quadratic Systems in $\mathbb{F}_2$ on FPGAs

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## The MP Problem

Solving a system of  $m$  multivariate polynomial equations in  $n$  variables over  $\mathbb{F}_q$  is called the *MP problem*.

The MP problem is an **NP-hard problem** even for multivariate *quadratic* systems and  $q = 2$ .

## Multivariate Public-Key Cryptography:

e.g. HFE, SFLASH, and QUARTZ

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## Algebraic Cryptanalysis:

Obtain a system of multivariate polynomial equations with the secret among the variables.

- ▶ Naturally breaks the above,
- ▶ does not break AES as first advertised,
- ▶ but does break, e.g., KeeLoq.

**Complexity?**

## Most Efficient Algorithm for $\mathbb{F}_2$ :

Brute-force search, testing all  $2^n$  possible inputs.

## Previous Work:

On **GPUs** we can solve a quadratic system of  
*48+ equations in 48 variables in 21min.*

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## Research Question:

*How would specifically designed hardware perform on this task?*

We approach the answer by solving multivariate quadratic systems on reconfigurable hardware (**FPGAs**).

## Full-Evaluation Approach

- ▶ Evaluate the whole equation for each possible input.
- ▶ Time Complexity:  $O(2^n n^2)$
- ▶ Memory Complexity:  $O(n)$

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- ▶ Only re-compute those parts of the equation that have changed.
- ▶ Enumerate input vector in Gray-code order.
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**Trade computation for memory.**



# Gray-Code Approach

$$k = 01010_b; x_4 = 0, x_3 = 1, x_2 = 0, x_1 = 1, x_0 = 0$$

$$f = x_4x_2 + x_3x_0 + x_2x_1 + x_3 + x_1 + x_0 + 1$$

$$f = 0 \cdot 0 + 1 \cdot 0 + 0 \cdot 1 + 1 + 1 + 0 + 1$$

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$$k = 010\mathbf{0}1_b \text{ in Gray-code order}$$

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$$f = f(01011_b) + \frac{\partial f}{\partial x_1}(01001_b)$$

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## Lookup Table (LUT) – LUT-6

Can be seen as

- ▶ logic: compute any logical expression in 6 variables,
- ▶ ROM: store 64bit, addressed by 6 address ports.

Can be used as two LUT-5 with identical input wires and independent output wires.



## Resources

- ▶ 50% SLICEX
  - ▶ 4 LUT-6
  - ▶ 8 Flip-Flops
- ▶ 25% SLICEL
  - + wide multiplexers
  - + carry logic for large adders
- ▶ 25% SLICEM
  - + LUT can be used as shift registers
  - + LUT can be used as *RAM* sharing the same write address
- ▶ Block RAM, DSPs, IO, ...

# Gray-Code Algorithm

```
24: function EVAL(s)
25:   while s.i <  $2^n$  do
26:     s.i ← s.i + 1;
27:      $k_1$  ← BIT1(s.i);
28:      $k_2$  ← BIT2(s.i);
29:     if  $k_2$  valid then
30:        $s.d'[k_1]$  ←  $s.d'[k_1] \oplus s.d''[k_1, k_2]$ ;
31:     end if
32:      $s.y$  ←  $s.y \oplus s.d'[k_1]$ ;
33:     if  $s.y = 0$  then
34:       return shr(s.i, 1)  $\oplus$  s.i;
35:     end if
36:   end while
37: end function
```

# Parallelization

Fix  $i$  Variables for  $2^i$  Parallel Instances:

$$f = x_4x_2 + x_3x_0 + x_2x_1 + x_3 + x_1 + x_0 + 1$$

e.g.  $i = 2$  :

$$f_{00_b} = 0 \cdot x_2 + 0 \cdot x_0 + x_2x_1 + 0 + x_1 + x_0 + 1$$

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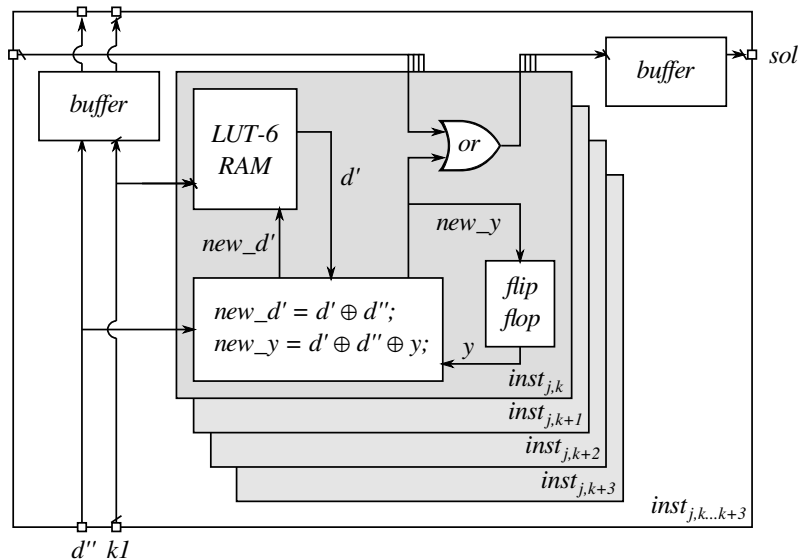
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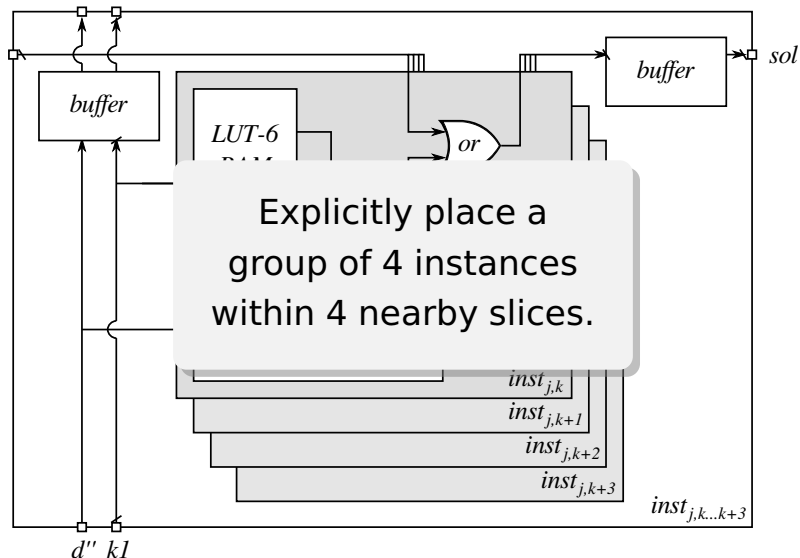
$2^i$  independent equations (systems)  
sharing the *same* quadratic terms!

# Instance

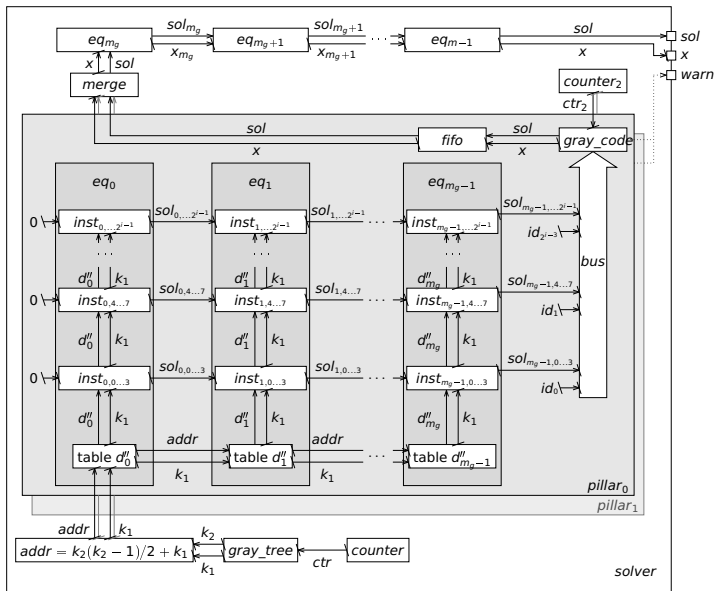




# Instance



# Overall Architecture





Xilinx Tools tend to fail for those parts of the design with the highest need for efficiency!

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## Development Strategy

We require some kind of low-level, assembly-like HDL:

- ▶ Use Python scripts for code generation.
- ▶ Assign most of the logic explicitly to LUT-6.
- ▶ Fully pipeline the design.
- ▶ Explicitly place components to achieve 200MHz.
- ▶ Exchange LUT data without resynthesizing.

# Synthesis Tools

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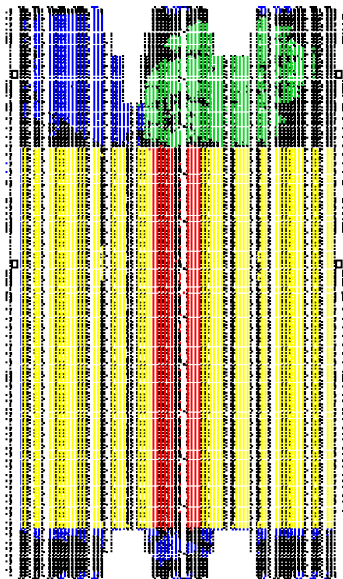
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## Missing in our tool chain:

- ▶ Explicit routing.
- ▶ Totally avoid Verilog/VHDL; program low levels directly.

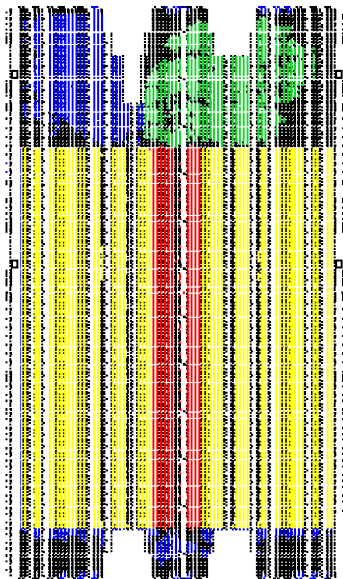
## Parameters:

- ▶  $n = 54$
- ▶  $m = 54$
- ▶  $2^{10}$  instances, two pillars
- ▶  $m_g = 12$



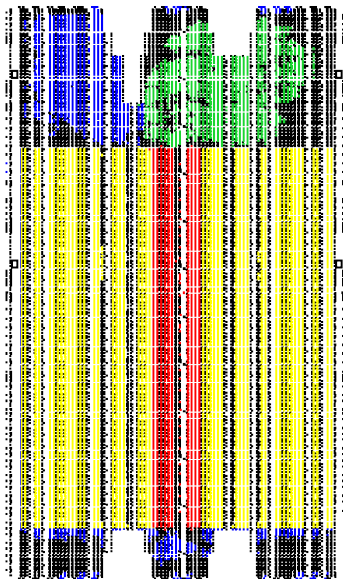
## Performance:

- ▶ 200MHz
- ▶ 8.8W (GPU: 235W)
- ▶ runtime:  
 $2^{54-10}/200\text{MHz} = 24.43\text{h}$
- ▶ runtime for  $n = 48$ :  
 $2^{48-10}/200\text{MHz} = 22.91\text{min}$   
(GPU: 21min)
- ▶ total energy for  $n = 48$ :  
3,4Wh (GPU: 82.3Wh)



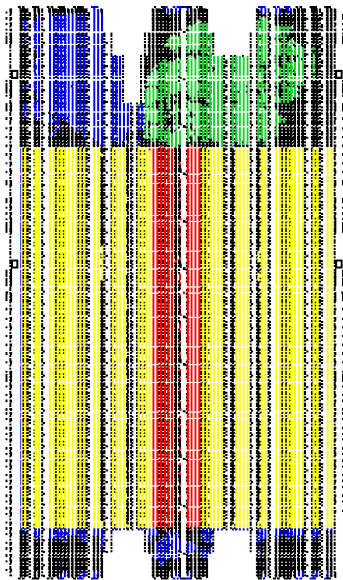
## Large FPGA Clusters:

Same routing and placement for any equation system by simply exchanging LUT data.



## 80-bit Security:

Solving a system of 80 variables requires 1042 days on 65,536 Spartan-6 FPGAs at a total cost of about US\$40 million.



Questions?