# Extending SAT Solvers to Cryptographic Problems 

Mate Soos, Karsten Nohl, Claude Castelluccia<br>INRIA Rhône-Alpes, University of Virginia

July 1, 2009

## Table of Contents

(1) Background

- DPLL-based SAT solvers
- Stream ciphers
(2) Adapting the SAT solver
- XOR-support
- Gaussian elimination
- Dynamic behaviour analysis
(3) Adapting the cipher representation
- Logical circuit representation
- Representation of non-linear functions
(4) Implemented attacks
- Crypto-1 and HiTag2
- Bivium


## Outline

(1) Background

- DPLL-based SAT solvers
- Stream ciphers
(2) Adapting the SAT solver
- XOR-support
- Gaussian elimination
- Dynamic behaviour analysis
(3) Adapting the cipher representation
- Logical circuit representation
- Representation of non-linear functions

4) Implemented attacks

- Crypto-1 and HiTag2
- Bivium


## DPLL-based SAT solvers

- A tool to solve a problem given in clauses ('and' of 'or'-s)
- Performs unit propagation
- Picks a variable to branch on, works on the two sub-problems
- Optimisations:
- learning
- non-chronological backjumping
- restarting
- variable choice
- implementation details
- We used MiniSat2


## Stream ciphers

- Uses a set of shift registers
- Shift registers' feedback function is either linear or non-linear
- Uses a filter function to generate 1 secret bit from the state
- Working: clock-filter-clock-filter. . . = feedback-filter-feedback-filter...



## Outline

(1) Background

- DPLL-based SAT solvers
- Stream ciphers
(2) Adapting the SAT solver
- XOR-support
- Gaussian elimination
- Dynamic behaviour analysis
(3) Adapting the cipher representation
- Logical circuit representation
- Representation of non-linear functions
(4) Implemented attacks
- Crypto-1 and HiTag2
- Bivium


## Problem with XOR-s

The truth

$$
a \oplus b \oplus c
$$

must be put into the solver as
$a \vee \bar{b} \vee \bar{c}$

$$
\begin{equation*}
a \vee b \vee c \tag{4}
\end{equation*}
$$

(3)

$$
\begin{align*}
& \bar{a} \vee \bar{b} \vee c  \tag{1}\\
& \bar{a} \vee b \vee \bar{c} \tag{2}
\end{align*}
$$

So, it takes $2^{n-1}$ clauses to model an $n$-long XOR

## Problem with XOR-s

To model the truth

$$
x_{1} \oplus x_{2} \oplus x_{3} \oplus x_{4} \oplus x_{5} \oplus x_{6} \oplus x_{7} \oplus x_{8}
$$

the following truths are put into the SAT solver (cutting)

$$
\begin{aligned}
& \overline{y_{1}} \oplus x_{1} \oplus x_{2} \oplus x_{3} \oplus x_{4} \\
& \overline{y_{2}} \oplus x_{5} \oplus x_{6} \oplus x_{7} \oplus x_{8}
\end{aligned} \quad y_{1} \oplus y_{2}
$$

Problems: still too long, extra vars

## Solution to XOR-s

Xor-clauses [Massacci00Taming]:

$$
a \oplus b \oplus c
$$

represents all the regular clauses
$a \vee \bar{b} \vee \bar{c}$

$$
\begin{align*}
& \bar{a} \vee \bar{b} \vee c  \tag{1}\\
& \bar{a} \vee b \vee \bar{c} \tag{3}
\end{align*}
$$

and changes appearance to match the regular clause that is the most pertinent to the situation. Gives this changed appearance to the analyze() method

Uses a watched variable scheme instead of a watched literal scheme Gain:

- $2.2 x$ in speed
- order of magnitude in memory


## Gaussian elimination

- Gaussian elimination is an efficient algorithm for solving systems of linear equations
- XOR-clause is a linear equation $\rightarrow$ use Gauss elim. to solve the system of XORs-clauses
xor-clauses
with $v 8$ assigned to true

| $v 10$ | $v 8$ | $v 9$ | $v 12$ | const |
| :---: | :---: | :---: | :---: | :---: |
| $\left[\begin{array}{cccc\|c}1 & - & 1 & 1 & 1 \\ 0 & - & 1 & 1 & 1 \\ 0 & - & 0 & 1 & 0 \\ 0 & - & 0 & 0 & 0\end{array}\right]$ |  |  |  |  |$\quad$| $v 10$ | $v 8$ | $v 9$ | $v 12$ | const |
| :---: | :---: | :---: | :---: | :---: |
| $\left[\begin{array}{ccccc}1 & 1 & 1 & 1 & 0 \\ 0 & 0 & 1 & 1 & 1 \\ 0 & 1 & 0 & 1 & 1 \\ 0 & 1 & 0 & 0 & 1\end{array}\right]$ |  |  |  |  |

- make temp. XOR-clause out of the interesting clauses found
- given prop. row 3, save temp. XOR-clause for a short while
- given a conflict, give it to analyze() and delete it


## Gaussian elimination results



Gaussian elimination until depth
No. of propagations
( $\sim$ search space)


Gaussian elimination until depth

## Visual representation

It's hard to follow how a solver operates. So we implemented dynamic behaviour analysis


Figure: Graphviz visualisation of an example search for the Crypto-1 cipher's states. The tree is read from left to right, top to bottom: the left- and bottommost pentagon is the first conflict clause, the right- and bottommost circle is the satisfying assignment.

## Detailed statistics

## Statistics generated:

- No. times variable branched upon
- Number of conflicts made by clause groups
- Propagation depth order of clause groups
- Avg. conflict depth order of clause groups


## Outline

(1) Background

- DPLL-based SAT solvers
- Stream ciphers
(2) Adapting the SAT solver
- XOR-support
- Gaussian elimination
- Dynamic behaviour analysis
(3) Adapting the cipher representation
- Logical circuit representation
- Representation of non-linear functions
(4) Implemented attacks
- Crypto-1 and HiTag2
- Bivium


## Logical circuit representation

Best to look at the cipher as a logical circuit inside the solver. The logical circuit has variables (boxes), functions (hexagons) and the known keystream.


## Measures of the logical circuit representation

Measures of this logical circuit representation:

- Depth of each keystream bit is the number of functions traversed from the reference state
- Reference state dependency numbers: no. bits each keystream bit depends on. A large part of these must be guessed before evaluation can take place
- Function difficulty. When traversed, these must be calculated Goal: minimise all of these


## Generate logical circuit from CNF

We wrote an extension to MiniSat to visualise the logical circuit. Example HiTag2 logical circuit:


## Optimising representation of non-linear functions

Simple $\mathbb{G F}(2)$ polynomial

$$
x_{1}+x_{1} x_{2}+x_{2} x_{3}+x_{1} x_{3}
$$

It is usually represented with each non-single monomial expressed as a set of clauses, setting additional variables $i_{1} \ldots i_{3}$. The polynomial then becomes

$$
x_{1}+i_{1}+i_{2}+i_{3}
$$

With this representation, no. of clauses is $3 \times 3$ regular +1 xor-clause, avg. clause length 4.14. Three extra variables also needed

However, representation using a Karnaugh table is

$$
\bar{x}_{1} \vee \bar{x}_{3} \quad \bar{x}_{2} \vee x_{3} \quad \bar{x}_{1} \vee \bar{x}_{2}
$$

## Outline

(1) Background

- DPLL-based SAT solvers
- Stream ciphers
(2) Adapting the SAT solver
- XOR-support
- Gaussian elimination
- Dynamic behaviour analysis
(3) Adapting the cipher representation
- Logical circuit representation
- Representation of non-linear functions
(4) Implemented attacks
- Crypto-1 and HiTag2
- Bivium


## Crypto-1\&HiTag2

## Crypto-1

- Best attack with SAT-solvers[Courtois08Algebraic]: 200 seconds, but this uses mathematical means to bring down the complexity (simple, as Crypto- 1 uses only an LFSR)
- We break it in 40 seconds.


## HiTag2

- Without our optimisation: $2^{21} \mathrm{~s}$ to break
- Takes $2^{14.5}$ s to break with our technique


## Bivium

Bivium is a simplified version of Trivium. Best attack against it takes $2^{43} \mathrm{~s}$.


We break it in $2^{36.5} \mathrm{~s}$.

## Thank you for your time

Thank you for your time!

