# Revisiting and Improving Algorithms for the 3XOR Problem 

Charles Bouillaguet ${ }^{1} \quad$ Claire Delaplace ${ }^{1,2} \quad$ Pierre-Alain Fouque ${ }^{2}$
${ }^{2}$ University of Rennes 1, IRISA, France
${ }^{1}$ University of Lille, CRIStAL, France

FSE 2018, Bruges
7th of March

## 3XOR Problem

## Problem

Given three lists $A, B$, and $C$ of uniformly random elements of $\{0,1\}^{n}$, find $(a, b, c) \in A \times B \times C$, such that $a \oplus b \oplus c=0$.


- Difficult case of Generalised Birthday Problem
- Application in cryptanalysis of some authenticated encryption scheme
- Lists formed by querying oracles $\Rightarrow$ can be as big as we want
- $|A| \cdot|B| \cdot|C| \geq 2^{n} \Rightarrow$ solution w.h.p.
(1) Background
(2) Our New Algorithm
(3) Adaptation of BDP Algorithm for the 3SUM problem


## A Naive Quadratic Algorithm

Idea

- Create all $v=a \oplus b$
- Check if $v$ is in $C$


## A Naive Quadratic Algorithm

## Idea

- Create all $v=a \oplus b$
- Check if $v$ is in $C$
- Time complexity: $\mathcal{O}(|A| \cdot|B|+|C|)$
- Space: $\mathcal{O}(|A|+|B|+|C|)$
- $|A|=|B|=|C|=2^{n / 3} \Rightarrow$ Time: $\mathcal{O}\left(2^{2 n / 3}\right)$, Space: $\mathcal{O}\left(2^{n / 3}\right)$
- $|A|=|B|=2^{n / 4},|C|=2^{n / 2} \Rightarrow$ Time: $\mathcal{O}\left(2^{n / 2}\right)$, Space: $\mathcal{O}\left(2^{n / 2}\right)$


## A Naive Quadratic Algorithm

## Idea

- Create all $v=a \oplus b$
- Check if $v$ is in $C$
- Time complexity: $\mathcal{O}(|A| \cdot|B|+|C|)$
- Space: $\mathcal{O}(|A|+|B|+|C|)$
- $|A|=|B|=|C|=2^{n / 3} \Rightarrow$ Time: $\mathcal{O}\left(2^{2 n / 3}\right)$, Space: $\mathcal{O}\left(2^{n / 3}\right)$
- $|A|=|B|=2^{n / 4},|C|=2^{n / 2} \Rightarrow$ Time: $\mathcal{O}\left(2^{n / 2}\right)$, Space: $\mathcal{O}\left(2^{n / 2}\right)$

Time/Space tradeoff: Well studied in the past (e.g. [Wagner02], [Bernstein07]).

## Wagner and its descendants



## Description

- Number of queries: increased up to $\simeq 2^{n / 2}$
- Elements of $C$ start by $p$


## Wagner and its descendants



## Description

- Number of queries: increased up to $\simeq 2^{n / 2}$
- Elements of $C$ start by $p$
- For all a, b s.t.
$a \oplus b=(p \mid *)$ search $a \oplus b$ in $C$


## Wagner and its descendants



## Description

- Number of queries: increased up to $\simeq 2^{n / 2}$
- Elements of $C$ start by $p$
- For all a, b s.t.
$a \oplus b=(p \mid *)$ search $a \oplus b$ in $C$
[Wagner02]: $2^{n / 2}$ queries allowed
$|C|=1$.
Time/Space $\mathcal{O}\left(2^{n / 2}\right)$


## Wagner and its descendants



## Description

- Number of queries: increased up to $\simeq 2^{n / 2}$
- Elements of $C$ start by $p$
- For all $a, b$ s.t.
$a \oplus b=(p \mid *)$
search $a \oplus b$ in $C$
$[\mathrm{NS} 14]: 2^{\ell} \simeq \frac{2^{n / 2}}{\sqrt{(n / 2) / \ln (n / 2)}}$ queries allowed
$p$ : Most frequent prefix in $C$
Time/Space $\mathcal{O}\left(2^{n / 2} / \sqrt{n / \ln (n)}\right)$


## Wagner and its descendants



## Description

- Number of queries: increased up to $\simeq 2^{n / 2}$
- Elements of $C$ start by $p$
- For all a, b s.t.
$a \oplus b=(p \mid *)$ search $a \oplus b$ in $C$
[Joux09]: $2^{n / 2} / \sqrt{n / 2}$ queries allowed
$|C|=n / 2$, Basis change to force $p=0$
Time/Space $\mathcal{O}\left(2^{n / 2} / \sqrt{n}\right)$


## Discussion

Joux's Algorithm best time complexity but...

## Discussion

Joux's Algorithm best time complexity but...

## 96-bit 3XOR

- Joux Algorithm: about $2^{48}$ operations
- But about 1 PB of data $\Longrightarrow$ Impractical


## Discussion

Joux's Algorithm best time complexity but...

## 96-bit 3XOR

- Joux Algorithm: about $2^{48}$ operations
- But about 1 PB of data $\Longrightarrow$ Impractical
- Quad algorithm: with $|A|=|B|=|C|=2^{n / 3}$ : about $2^{64}$ operations
- But only 206 GB of data $\Longrightarrow$ Practical


## Discussion

Joux's Algorithm best time complexity but...

## 96-bit 3XOR

- Joux Algorithm: about $2^{48}$ operations
- But about 1 PB of data $\Longrightarrow$ Impractical
- Quad algorithm: with $|A|=|B|=|C|=2^{n / 3}$ : about $2^{64}$ operations
- But only 206 GB of data $\Longrightarrow$ Practical
$\Rightarrow$ Keep the lists small!


## The Clamping Trick [Berstein07]

- Idea: Increase the number of queries to reduce the storage


## The Clamping Trick [Berstein07]

- Idea: Increase the number of queries to reduce the storage
- $2^{k}$ queries, $k \geq n / 3$
- $\ell$ s.t. $(n-\ell) / 3=k-\ell$
- Discard vectors that do not start with $\ell$ zeroes


## The Clamping Trick [Berstein07]

- Idea: Increase the number of queries to reduce the storage
- $2^{k}$ queries, $k \geq n / 3$
- $\ell$ s.t. $(n-\ell) / 3=k-\ell$
- Discard vectors that do not start with $\ell$ zeroes
- Let $n^{\prime}=n-\ell$
- $\Rightarrow 3$ lists $A, B, C$ of $2^{k-\ell}=2^{n^{\prime} / 3}$ of $n^{\prime}$-bits vectors
- Solve the $3 X O R$ problem over $A, B, C$ with $|A| \cdot|B| \cdot|C|=2^{n^{\prime}}$


## The Clamping Trick [Berstein07]

- Idea: Increase the number of queries to reduce the storage
- $2^{k}$ queries, $k \geq n / 3$
- $\ell$ s.t. $(n-\ell) / 3=k-\ell$
- Discard vectors that do not start with $\ell$ zeroes
- Let $n^{\prime}=n-\ell$
- $\Rightarrow 3$ lists $A, B, C$ of $2^{k-\ell}=2^{n^{\prime} / 3}$ of $n^{\prime}$-bits vectors
- Solve the $3 X O R$ problem over $A, B, C$ with $|A| \cdot|B| \cdot|C|=2^{n^{\prime}}$


## $2^{n / 2}$ Queries

- $\ell=n / 4, n^{\prime}=3 n / 4$
- Stored data: $\mathcal{O}\left(2^{n / 4}\right)$ words
- Time Complexity: $\mathcal{O}\left(2^{n / 2}\right)$ with Quadratic Algorithm


## Our Work: A Generalization of Joux Algorithm



Generalization to any size of input lists

## Our Work: A Generalization of Joux Algorithm



Generalization to any size of input lists

- Pick $n-k$ arbitrary entries in $C$ (the first ones)


## Our Work: A Generalization of Joux Algorithm



Generalization to any size of input lists

- Pick $n-k$ arbitrary entries in $C$ (the first ones)
- Apply Joux's Algorithm


## Our Work: A Generalization of Joux Algorithm



Generalization to any size of input lists

- Pick $n-k$ arbitrary entries in $C$ (the first ones)
- Apply Joux's Algorithm (O)(|A|+|B|))


## Our Work: A Generalization of Joux Algorithm



Generalization to any size of input lists

- Pick $n-k$ arbitrary entries in $C$ (the first ones)
- Apply Joux's Algorithm (O)(|A|+|B|))
- Re-iterate with $n-k$ other rows...


## Our Work: A Generalization of Joux Algorithm



Generalization to any size of input lists

- Pick $n-k$ arbitrary entries in $C$ (the first ones)
- Apply Joux's Algorithm (O)(|A|+|B|))
- Re-iterate with $n-k$ other rows...


## Our Work: A Generalization of Joux Algorithm



Generalization to any size of input lists

- Pick $n-k$ arbitrary entries in $C$ (the first ones)
- Apply Joux's Algorithm (O)(|A|+|B|))
- Re-iterate with $n-k$ other rows...
- ... until all $C$ has been watched ( $\simeq \frac{|c|}{n-k}$ iterations $)$


## Our Work: A Generalization of Joux Algorithm



Generalization to any size of input lists

- Pick $n-k$ arbitrary entries in $C$ (the first ones)
- Apply Joux's Algorithm (O)(|A|+|B|))
- Re-iterate with $n-k$ other rows...
- ... until all $C$ has been watched ( $\simeq \frac{|c|}{n-k}$ iterations $)$
$k=\log _{2}(\min (|A|,|B|))$, Time: $\mathcal{O}\left((|A|+|B|) \cdot \frac{|C|}{n}\right)$


## Our Work: A Generalization of Joux Algorithm



Generalization to any size of input lists

- Pick $n-k$ arbitrary entries in $C$ (the first ones)
- Apply Joux's Algorithm (O)(|A|+|B|))
- Re-iterate with $n-k$ other rows...
- ... until all $C$ has been watched ( $\simeq \frac{|c|}{n-k}$ iterations $)$

$$
|A|=|B|=|C|=2^{n / 3} ; k=n / 3, \text { Time: } \mathcal{O}\left(\frac{2^{2 n / 3}}{n}\right)
$$

## A Concrete Example

## A 96-bit 3XOR



- Require $3 \cdot 2^{48}$ queries


## A Concrete Example

## A 96-bit 3XOR



- Require $3 \cdot 2^{48}$ queries
- Perform the clamping on 24 bits


## A Concrete Example

## A 96-bit 3XOR



- Require $3 \cdot 2^{48}$ queries
- Perform the clamping on 24 bits
- Process the lists on the first 64 bits of each entries (Find all solutions)


## A Concrete Example

## A 96-bit 3XOR



- Require $3 \cdot 2^{48}$ queries
- Perform the clamping on 24 bits
- Process the lists on the first 64 bits of each entries (Find all solutions)
- Test them on the remaining 8 bits (about 256 tests)


## A Concrete Example

## A 96-bit 3XOR



- Require $3 \cdot 2^{48}$ queries
- Perform the clamping on 24 bits
- Process the lists on the first 64 bits of each entries (Find all solutions)
- Test them on the remaining 8 bits (about 256 tests)


## Experimentations

- 3XOR of 96 bits of SHA-256
- Tests performed on a Haswell Core i5 CPU


## Timing

|  | Quadratic | Our Algorithm |
| :--- | :---: | :---: |
| CPU hours | 340 | 105 |
| Data | 576 MB | 576 MB |

## Experimentations

- 3XOR of 96 bits of SHA-256
- Tests performed on a Haswell Core i5 CPU


## Timing

|  | Quadratic | Our Algorithm |
| :--- | :---: | :---: |
| CPU hours | 340 | 105 |
| Data | 576 MB | 576 MB |

Creation of the lists: $\times 100$ slower than processing them!

## In a Nutshell

## This Algorithm...

- can be applied to any size of input list
- has a $\times n$ speed-up compared to the Quadratic Algorithm
- is about 3 times faster, in practice ( $n=96$ )
- is faster than [NS14] with the same amount of data, in theory
- is the same than [Joux09] with the same amount of data


## In a Nutshell

## This Algorithm...

- can be applied to any size of input list
- has a $\times n$ speed-up compared to the Quadratic Algorithm
- is about 3 times faster, in practice ( $n=96$ )
- is faster than [NS14] with the same amount of data, in theory
- is the same than [Joux09] with the same amount of data


## Possible improvements

Find basis changes that increase the size of the sublists

- We propose two ways of doing this
- Only a constant time improvement in theory


## A 3XOR Adaptation of [BDP05]

- Originally designed for the 3SUM Problem over $(\mathbb{Z},+$ )
- We transposed it for the 3XOR Problem


## A 3XOR Adaptation of [BDP05]

- Originally designed for the 3SUM Problem over $(\mathbb{Z},+$ )
- We transposed it for the 3XOR Problem
- Dispatch entries into buckets (according to the first $k$ bits)
- $A^{u}$ : Bucket of elements of $A$ starting by $u$
- For each triplet ( $A^{u}, B^{v}, C^{u \oplus v}$ ) perform constant time preliminary test
- Test $s$-bit partial collision with a hash table


## A 3XOR Adaptation of [BDP05]

- Originally designed for the 3SUM Problem over $(\mathbb{Z},+$ )
- We transposed it for the 3XOR Problem
- Dispatch entries into buckets (according to the first $k$ bits)
- $A^{u}$ : Bucket of elements of $A$ starting by $u$
- For each triplet ( $A^{u}, B^{v}, C^{u \oplus v}$ ) perform constant time preliminary test
- Test s-bit partial collision with a hash table
- If the test fail: no solution for sure
- If the test succeed: there may be a solution
- Solve the small instance


## Preliminary Test

Instance $\left(A^{u}, B^{\vee}, C^{u \oplus v}\right)$


## Discussion

## BDP In Theory

When $n$ grows up to infinity, only one triplet passes the test $\Longrightarrow$ complexity of the algorithm:

$$
\text { Time: } \mathcal{O}\left(\frac{2^{2 n / 3} \log ^{2}(n)}{n^{2}}\right) \text {, Space: } \mathcal{O}\left(2^{n / 3}\right)
$$

## Discussion

## BDP In Theory

When $n$ grows up to infinity, only one triplet passes the test $\Longrightarrow$ complexity of the algorithm:

$$
\text { Time: } \mathcal{O}\left(\frac{2^{2 n / 3} \log ^{2}(n)}{n^{2}}\right), \text { Space: } \mathcal{O}\left(2^{n / 3}\right)
$$

## BDP In Practice

$n=96$, machine words: 64 bits
Expected size of a bucket: $m=0.14$
$\Longrightarrow$ Completely impractical

## Conclusion

## This work

- Discusses issues arising from the $3 X O R$ problem
- Propose a new practical algorithm for the 3XOR problem, that is
- $n \times$ faster than the quadratic algorithm in theory
- $3 \times$ faster than the quadratic algorithm in practice
- Propose an adaptation of [BDP05] algorithm that is
- asymptotically faster than other algorithms
- Totally impractical


## Conclusion

## This work

- Discusses issues arising from the $3 X O R$ problem
- Propose a new practical algorithm for the 3XOR problem, that is
- $n \times$ faster than the quadratic algorithm in theory
- $3 \times$ faster than the quadratic algorithm in practice
- Propose an adaptation of [BDP05] algorithm that is
- asymptotically faster than other algorithms
- Totally impractical


## What's Next?

- Compute a 128 -bit 3XOR on SHA-256
- Expect to have the lists in about 2 years (using one Antminer S7)

Code available here:
https://github.com/cbouilla/3XOR

## Thank you for your time!

