

Reverse Cycle Walking and its Applications

Sarah Miracle and Scott Yilek

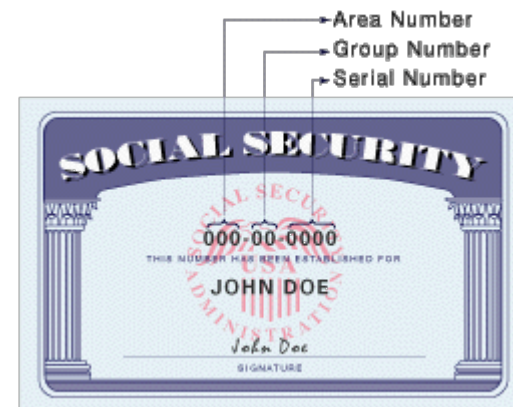
University of St. Thomas

Format Preserving Encryption

Example:

Existing database with millions of US social security numbers

- 9 digit numbers
- First 3 digits can't be 666
- And more . . .

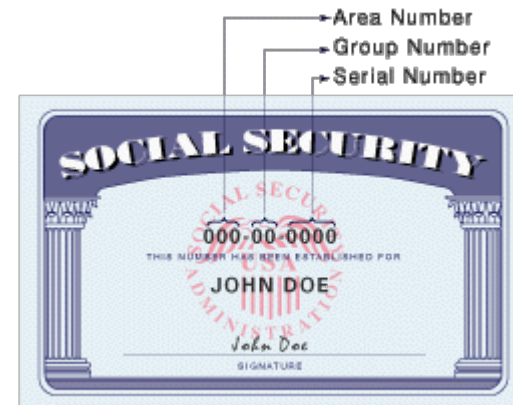


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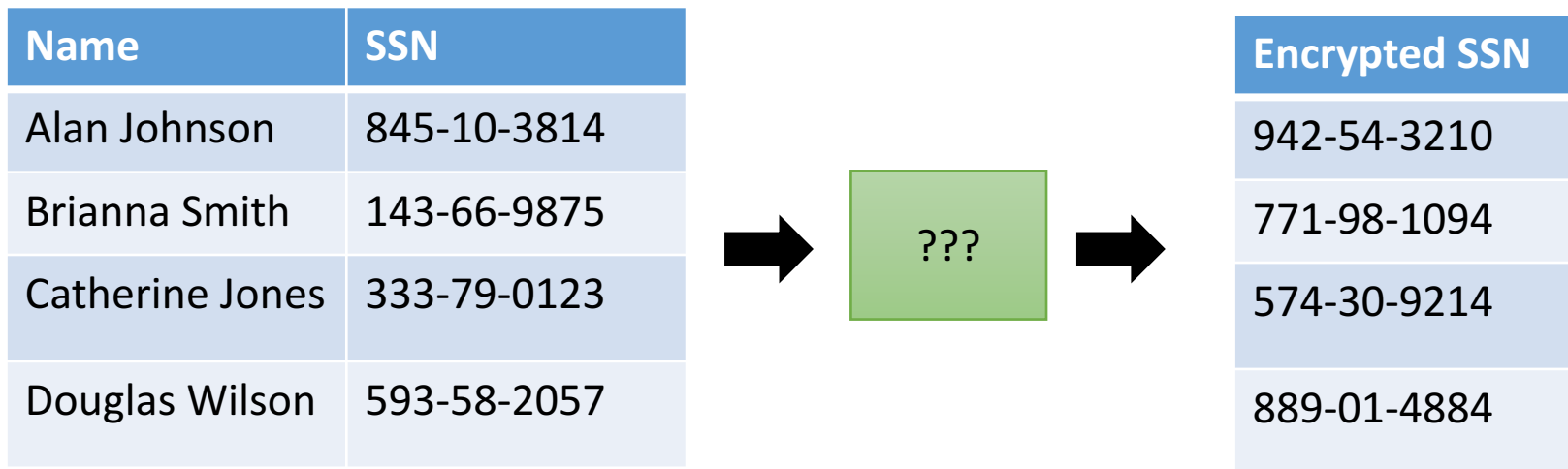
- Represent SSN as 30-bit numbers
- Pad with zeros
- Encrypt using a standard block cipher (e.g. AES)

Encrypted numbers have a significantly different format!

Format Preserving Encryption

Format Preserve Encryption schemes:

Encryption schemes in which ciphertexts have the same format as plaintexts.



Talk Outline

- Background and Previous Work
- Our Algorithm
- Proof Outline

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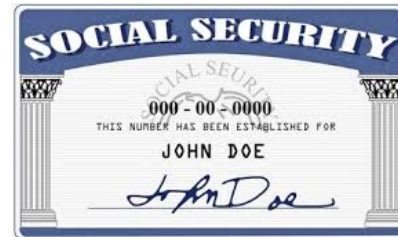
We'll only assume we can test membership in our
target domain set S

General Approach

1. Find a cipher on a larger set T
2. Transform it to a cipher on a smaller set S

Example: Social Security Numbers

- Let T be the set of 30-bit strings ($10^9 < 2^{30}$)
- There are many block ciphers to encipher 30-bit strings



Cycle Walking

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```
Algorithm  $CW_{\pi}(x)$ :  
-----  
do  
     $x \leftarrow \pi(x)$   
while( $x \notin S$ )  
return  $x$ 
```


Cycle Walking - Example

$T = \{0, \dots, 9\}$

$S = \{0, 2, 4, 6, 8\}$

Consider the **cycle structure**:

(9 4 6 5 1 0) (3 2 7 8)



(9 4 6 5 ~~1~~ ~~0~~) (3 2 7 8)



(4 6 0) (2 8)

Algorithm $CW_{\pi}(x)$:

do

$x \leftarrow \pi(x)$

while($x \notin S$)

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← Permutation on **T**

← Permutation on **S**

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 - In general?

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Can we do better?

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- Background and Previous Work
- Our Algorithm – an alternative to cycle walking
- Proof Outline

First Approach

$$T = \{0, \dots, 9\}$$

$$S = \{0, 2, 4, 6, 8\}$$

Consider the cycle structure:

$$(4 \ 1 \ 3 \ 5 \ 7 \ 0 \ 2 \ 9 \ 6 \ 8) \quad \leftarrow \text{Permutation on } T$$

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Idea: Cut-off Cycle Walking Early

Reverse Cycle Walking

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Consider the cycle structure:

(4 1 3 5 7 0 2 9 6 8)



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(6 8 4) (0 2)

Our Algorithm: Walk backward

Reverse Cycle Walking

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Consider the cycle structure:

(4 1 3 5 7 0 2 9 6 8)



(4 ~~1 3 5 7~~ 0 2 9 6 8)



(6 8 4) (0 2) → (4) (8) (6) (0 2)

Our Algorithm: Walk backward + only consider 2-cycles

Another Example

$$T = \{0, \dots, 9\}$$

$$S = \{0, 2, 4, 6, 8\}$$

Consider the **cycle structure**:

$$(9 \ 4 \ 6 \ 5 \ 1 \ 0) \ (3 \ 2 \ 7 \ 8) \quad \leftarrow \text{Permutation on } T$$

$$(9 \ 4 \ 6 \ 5 \ 1 \ 0) \ (3 \ 2 \ 7 \ 8)$$

$$(4 \ 6) \ (0) \ (2) \ (8) \quad \leftarrow \text{Permutation on } S$$

Reverse Cycle Walking

Algorithm $\text{RCW}_{\pi, B}(x)$:

$y \leftarrow \pi(x); z \leftarrow \pi^{-1}(x)$

if $y \in S$ and $z \notin S$ and $\pi(y) \notin S$:

$b \leftarrow B(x)$

 if $b = 1$ return y else return x

else if $y \notin S$ and $z \in S$ and $\pi^{-1}(z) \notin S$:

$b \leftarrow B(z)$

 if $b = 1$ return z else return x

else

 return x

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Answer: $O(\log |T|)$

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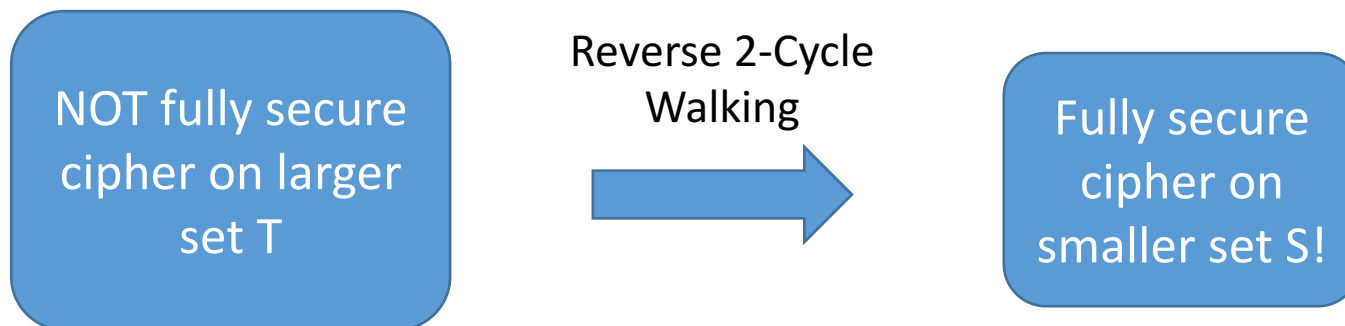
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under certain circumstances . . .

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- Background and Previous Work
- Reverse Cycle Walking
- Proof Outline – analyzing the mixing time of RCW

Mixing Time

Definition: The **total variation distance** is

$$\| P^t, \pi \| = \max_{x \in \Omega} \frac{1}{2} \sum_{y \in \Omega} |P^t(x,y) - \pi(y)|.$$

Definition: Given ε , the **mixing time** is

$$\tau(\varepsilon) = \min \{t: \|P^t, \pi\| < \varepsilon, \quad \forall t' \geq t\}.$$

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1. Show that RCW yields a “matching exchange process”
2. Defined and analyzed by Czumaj and Kutylowski [RSA '00]
3. Use same techniques but . . .
 - Give explicit constants for RCW algorithm
 - Reprove several key lemmas

Matching Exchange Process

Matching Exchange:

Repeat:

1. Choose a number κ according to some distribution.
2. Pick a matching M of size κ uniformly at random
3. For each pair in the matching,
 - transpose the two points with prob. $\frac{1}{2}$
 - otherwise, do nothing

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Theorem [Czumaj, Kutylowski]: If $E(\kappa)$ is $\Theta(n)$ then a matching exchange process mixes in time $O(\log n)$.

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[Bubley,Dyer,Greenhill' 97-8]

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$\Rightarrow O(n \log n)$

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- Let $M_1 \dots M_t$ be the matchings for process X and $N_1 \dots N_t$ be the matchings for process Y.

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High-level Approach:

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- Use a non-Markovian coupling
- Let $M_1 \dots M_t$ be the matchings for process X and $N_1 \dots N_t$ be the matchings for process Y.
- Choose $M_1 \dots M_t$ randomly – according to the alg.



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- Assume M_1 contains (u,z) and (v,w)
 - If you let $N_1 = M_1$ then X_1 and Y_1 differ by a (z,w) trans.
 - If you let $N_1 = M_1 - (u,z) - (v,w) + (u,w) + (v,z)$ then X_1 and Y_1 differ by a (u,v) trans.

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Call (u,v) and (z,w) “good pairs”.

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2. Show that with high probability, one of the next $\Theta(\log n)$ matchings contains a good pair

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- Improve the constants further
- Remove the bit flip
- Design an alternative algorithm
 - Expected $O(1)$ running time of cycle walking is very attractive

Questions?