

Counting Unpredictable Bits:
Simple PRG from OWFs

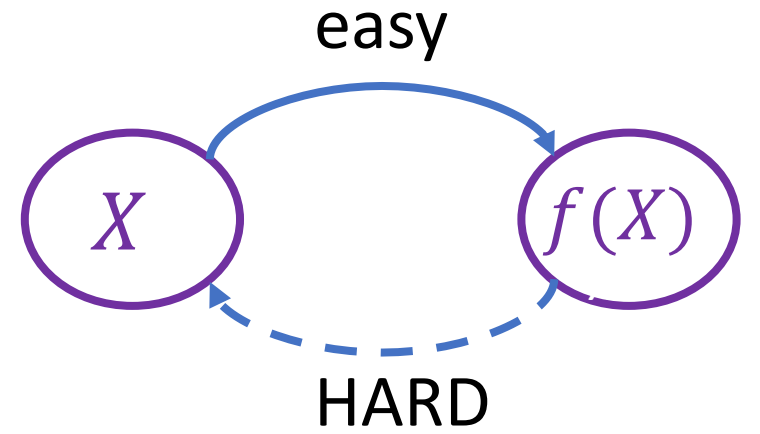
Noam Mazon

(Cornell Tech)

Rafael Pass

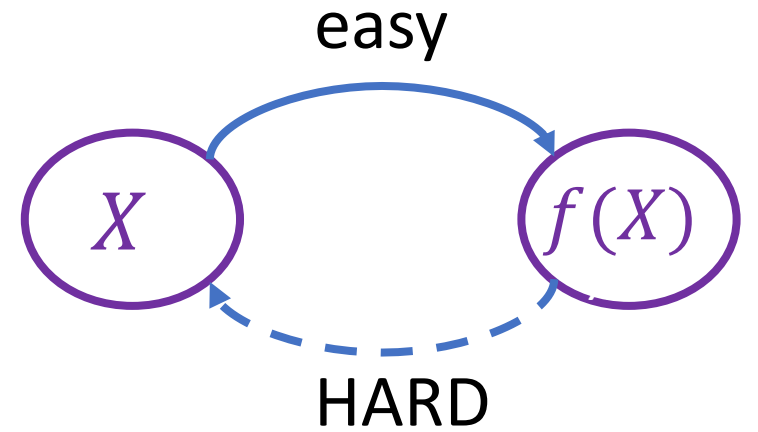
(Tel Aviv University & Cornell Tech)

One-Way Functions



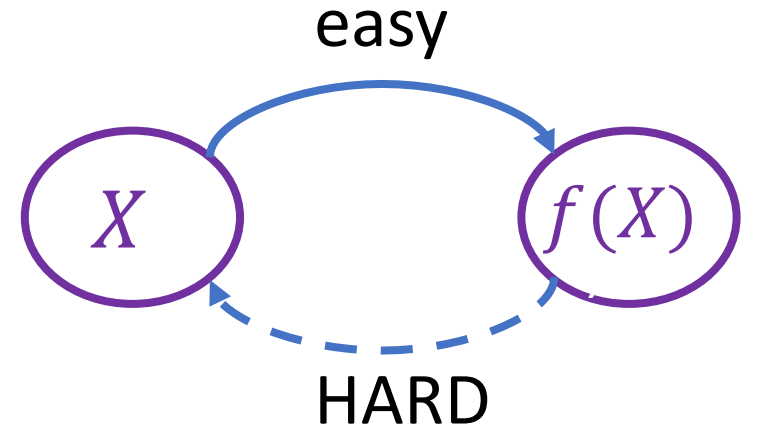
One-Way Functions

- The minimal assumption for cryptography



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- The minimal assumption for cryptography
- Can be used to construct many useful primitives



OWF \Rightarrow PRG

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Basic result in crypto [[Hstad-Impagliazzo-Levin-Luby](#)]

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Proving OWF \Rightarrow PRG

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General approach:

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Key insight: A simple weak notion of pseudorandomness

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Bits Unpredictability - Counting unpredictable bits

Next-Bit Unpredictability

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- Want $|S|$ to be large

Proof Overview

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Relying on simple tools (Goldreich-Levin, Chernoff, ...)

Part I:

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$$M(x) = M \cdot x = \langle M_1, x \rangle, \dots, \langle M_n, x \rangle$$

For $M = (M_1, \dots, M_n)$

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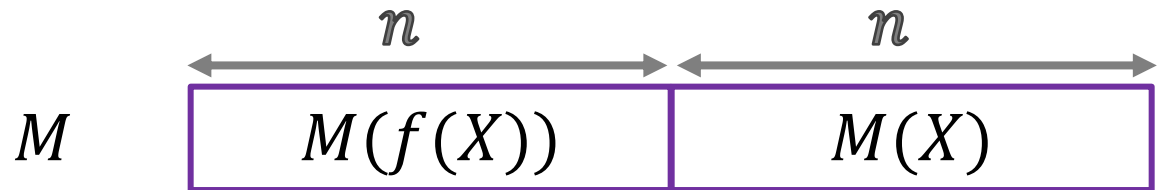
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$$g_M(X) = M(f(X)), M(X)$$



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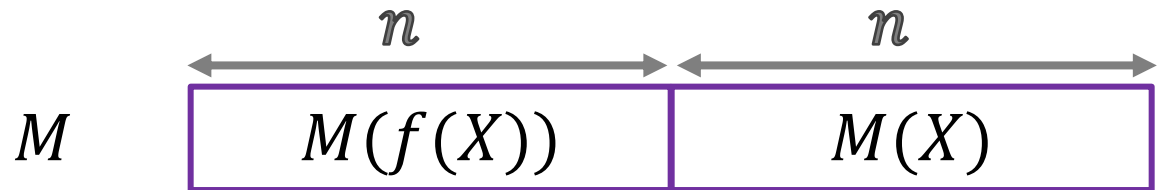
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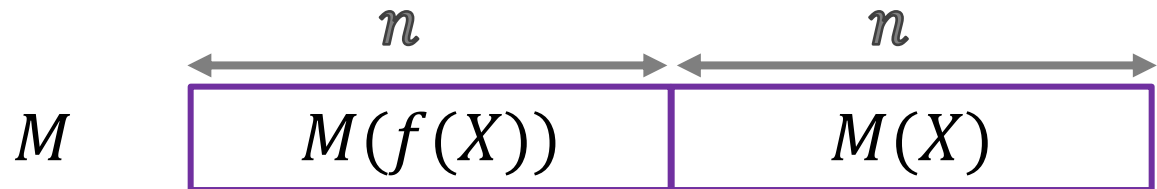
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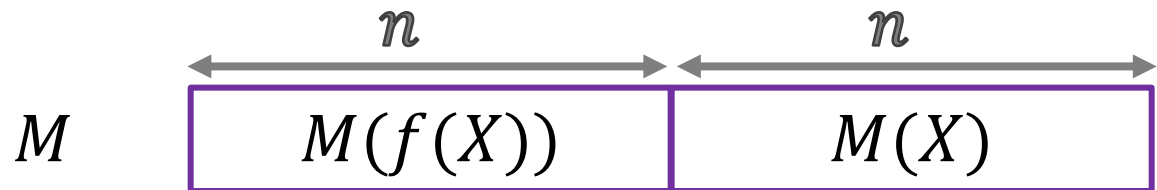
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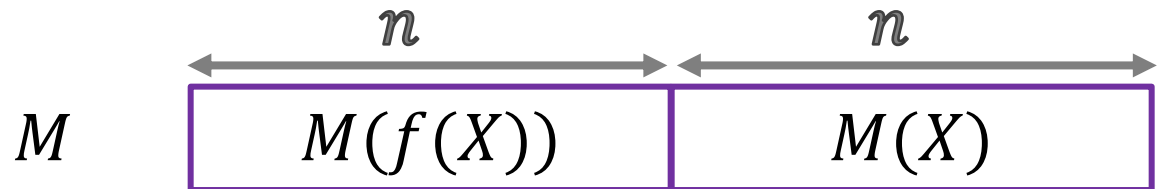
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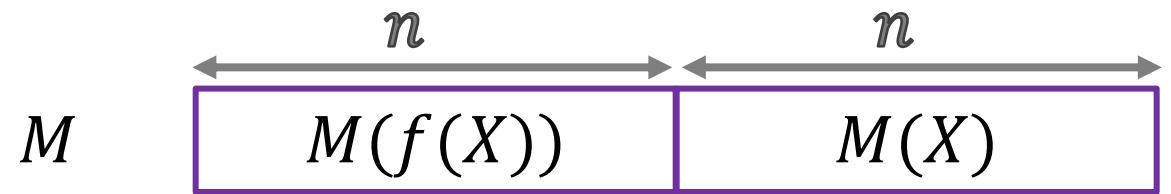
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Thm:

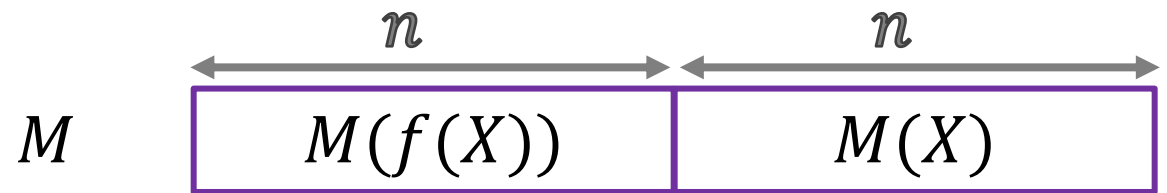
$g_M(X)$ has $(n + \log n)$ Bits Unpredictability (given M).

Proof: Bits Unpredictability from Regular OWF



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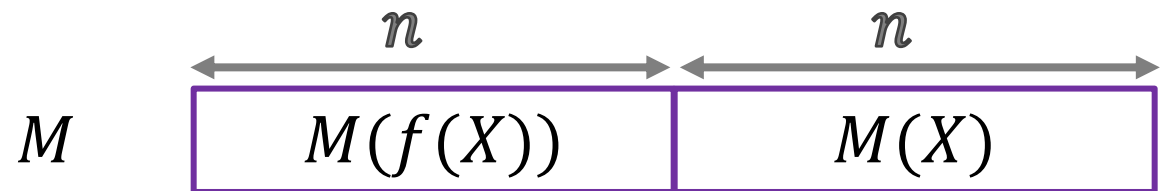
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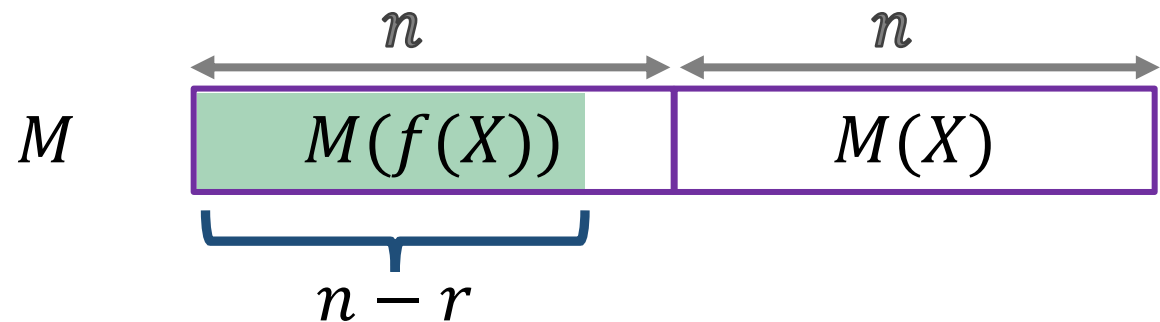
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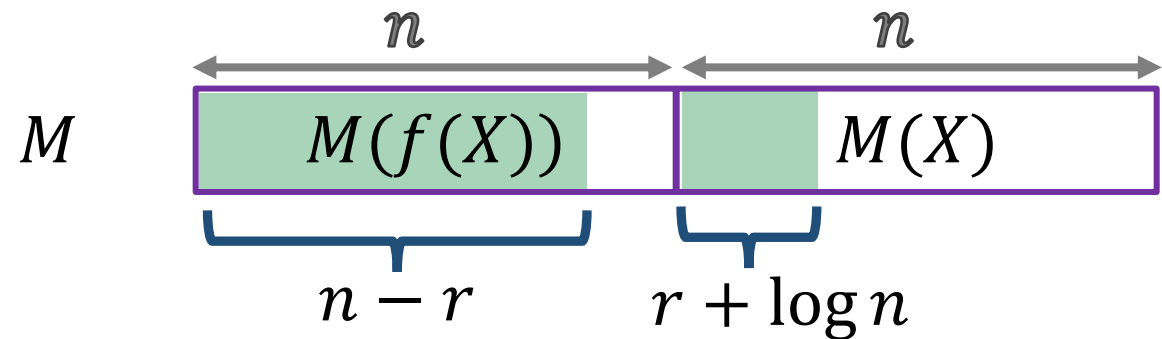
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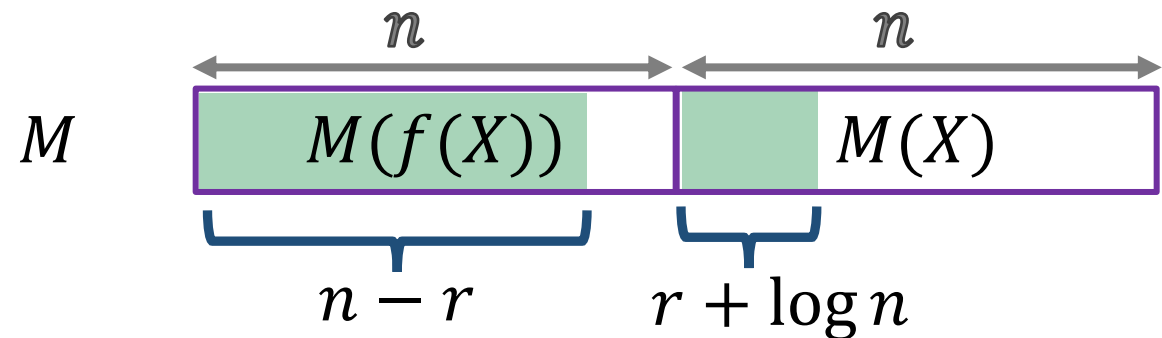
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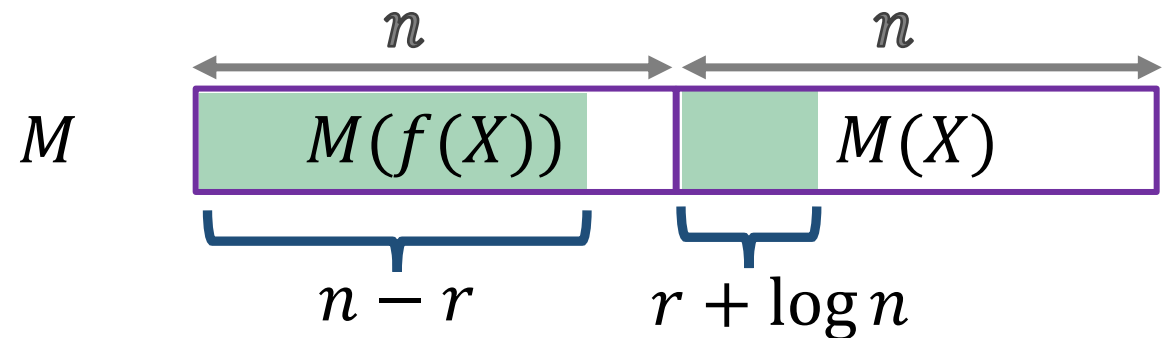


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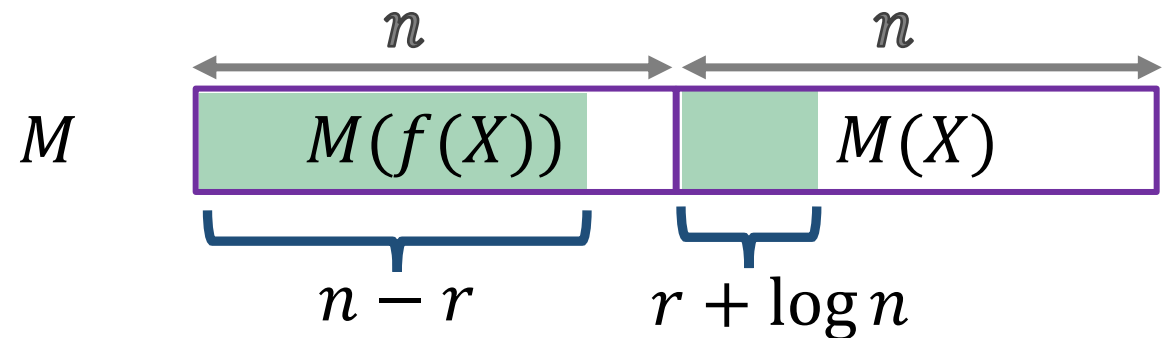
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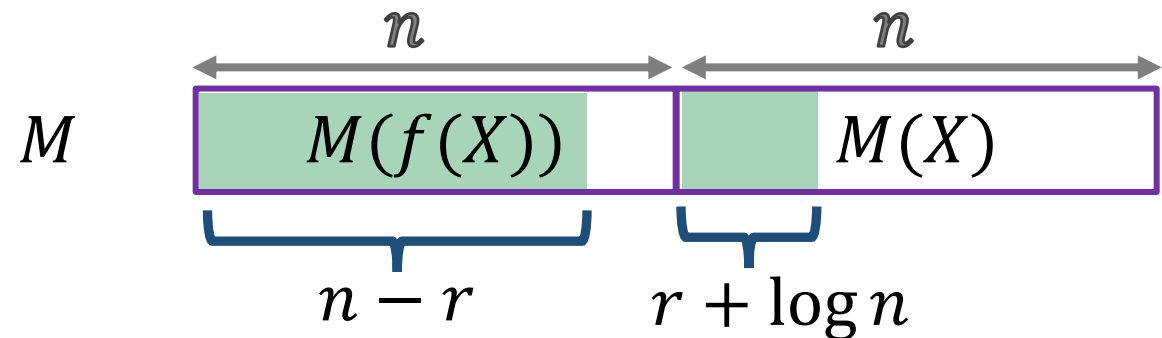
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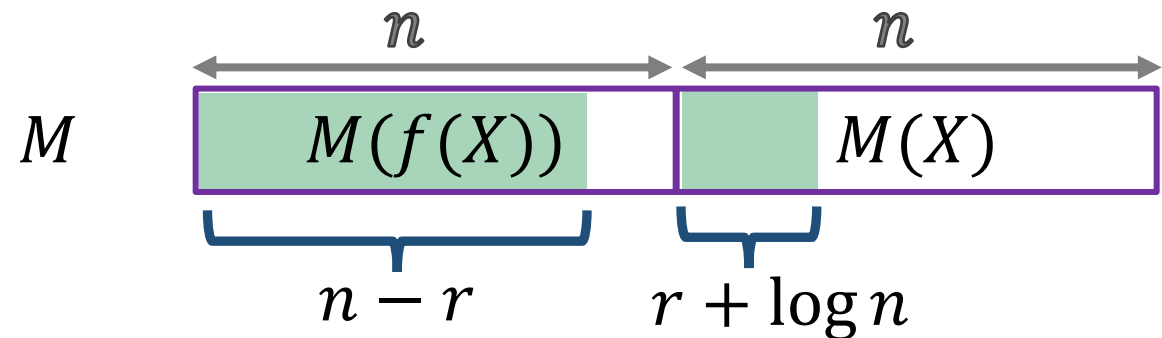
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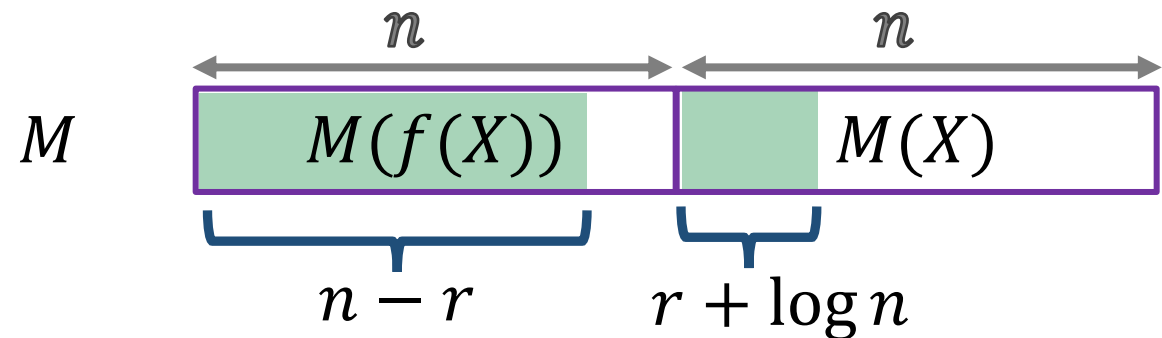
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 - Can extract r random bits + $\log n$ pseudorandom bits (GL)

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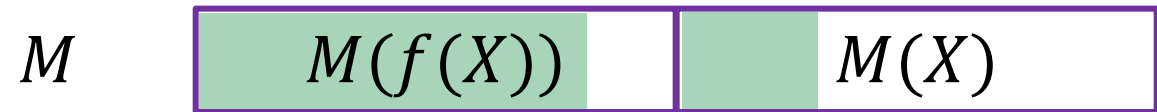
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When reading $g_M(X)$ bit-by-bit, there are $n + \log n$ unpredictable bits!

Proof: Bits Unpredictability from Any OWF

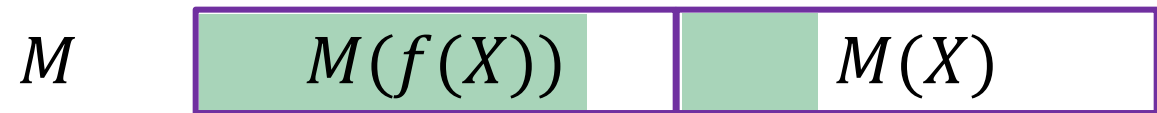
What about arbitrary OWFs?



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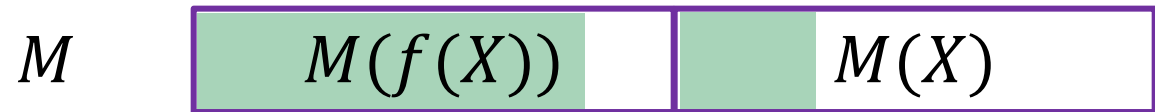
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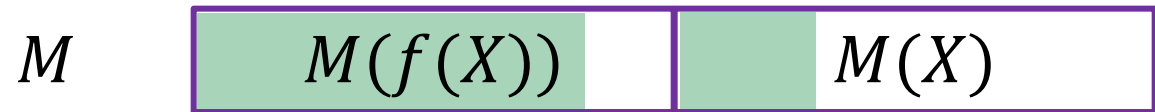


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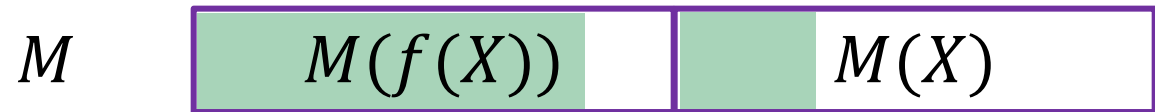


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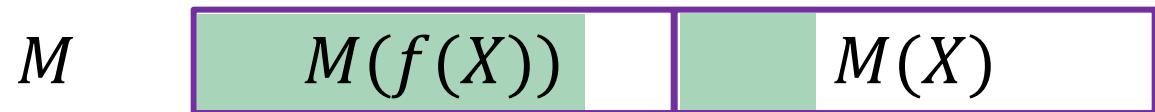
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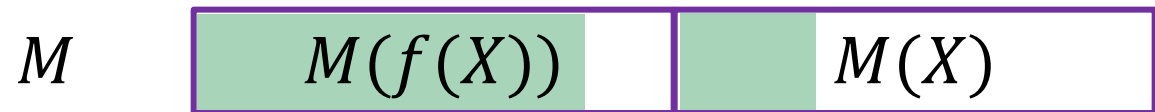
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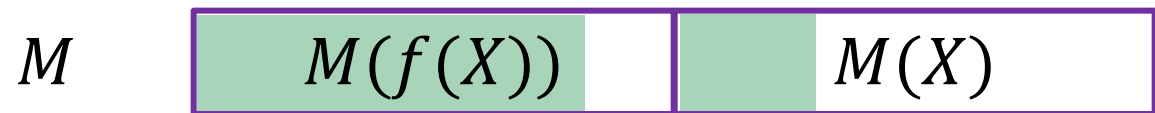
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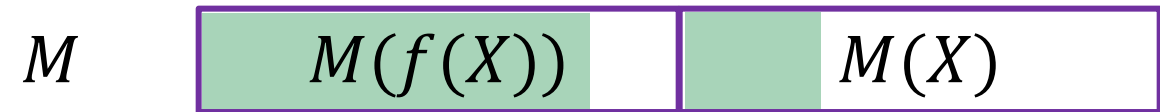
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$g_M(X)$ is a convex combination of distributions with
 $(n + \log n)$ Bits Unpredictability.

Part II:

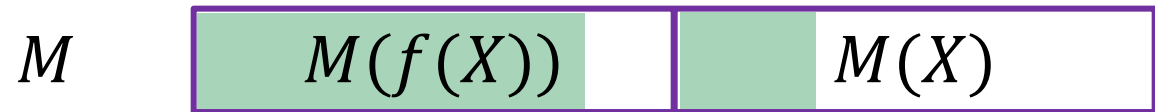
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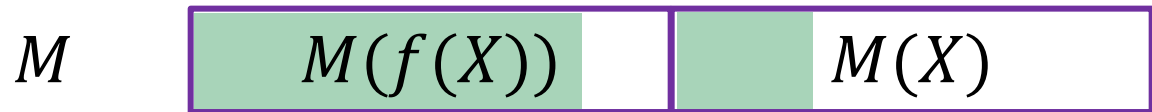
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M



Simple construction ([HRV])

Step 1: Bits Unpred. \rightarrow Random Bits Unpred.

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Problem: We don't know which bits are unpredictable

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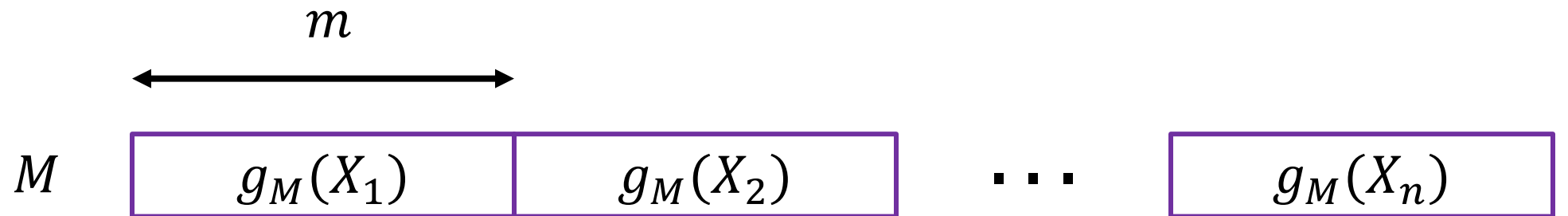
Problem: We don't know which bits are unpredictable

- Maybe the i -th bit is always predictable

Step 1: Bits Unpred. \rightarrow Random Bits Unpred.

Problem: We don't know which bits are unpredictable

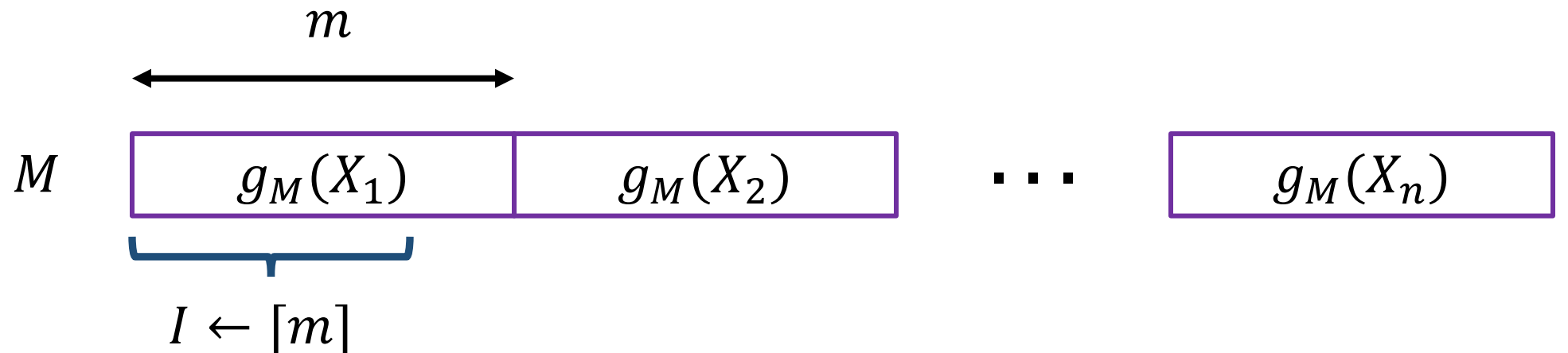
- Maybe the i -th bit is always predictable



Step 1: Bits Unpred. \rightarrow Random Bits Unpred.

Problem: We don't know which bits are unpredictable

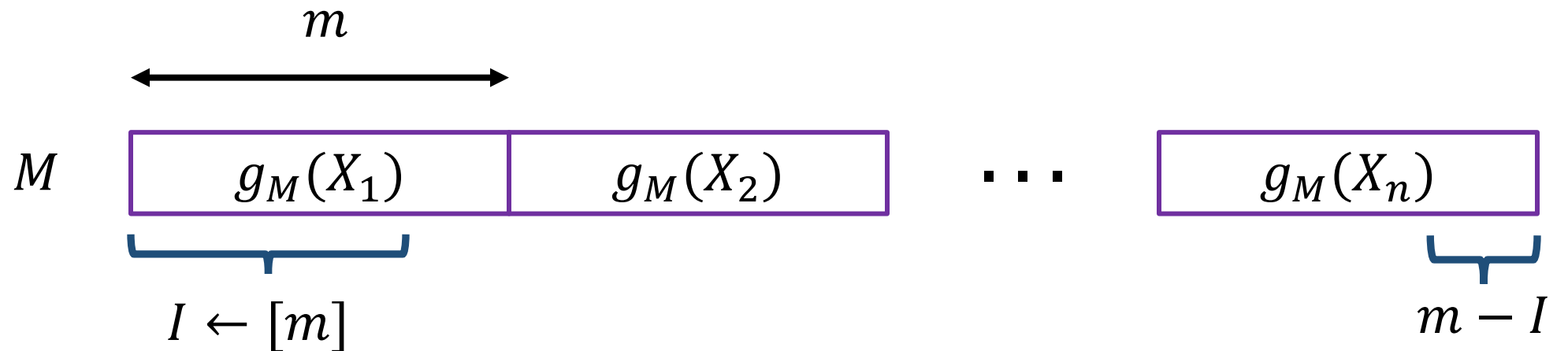
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Step 1: Bits Unpred. \rightarrow Random Bits Unpred.

Problem: We don't know which bits are unpredictable

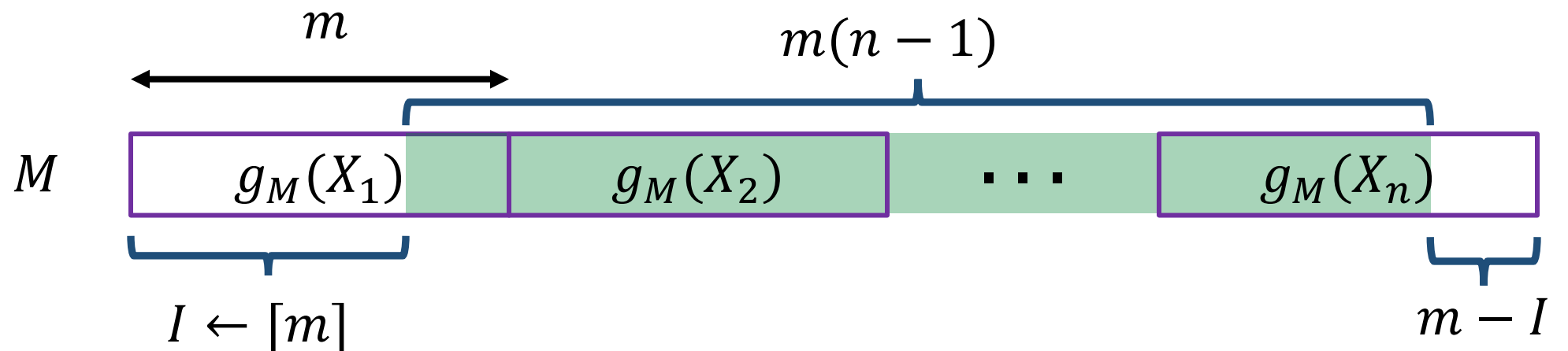
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Step 1: Bits Unpred. \rightarrow Random Bits Unpred.

Problem: We don't know which bits are unpredictable

- Maybe the i -th bit is always predictable



$$g_M^n(X_1, \dots, X_n, I) = g_M(X_1)_{\geq I}, g_M(X_2), \dots, g_M(X_n)_{< I}$$

Step 2: Extraction

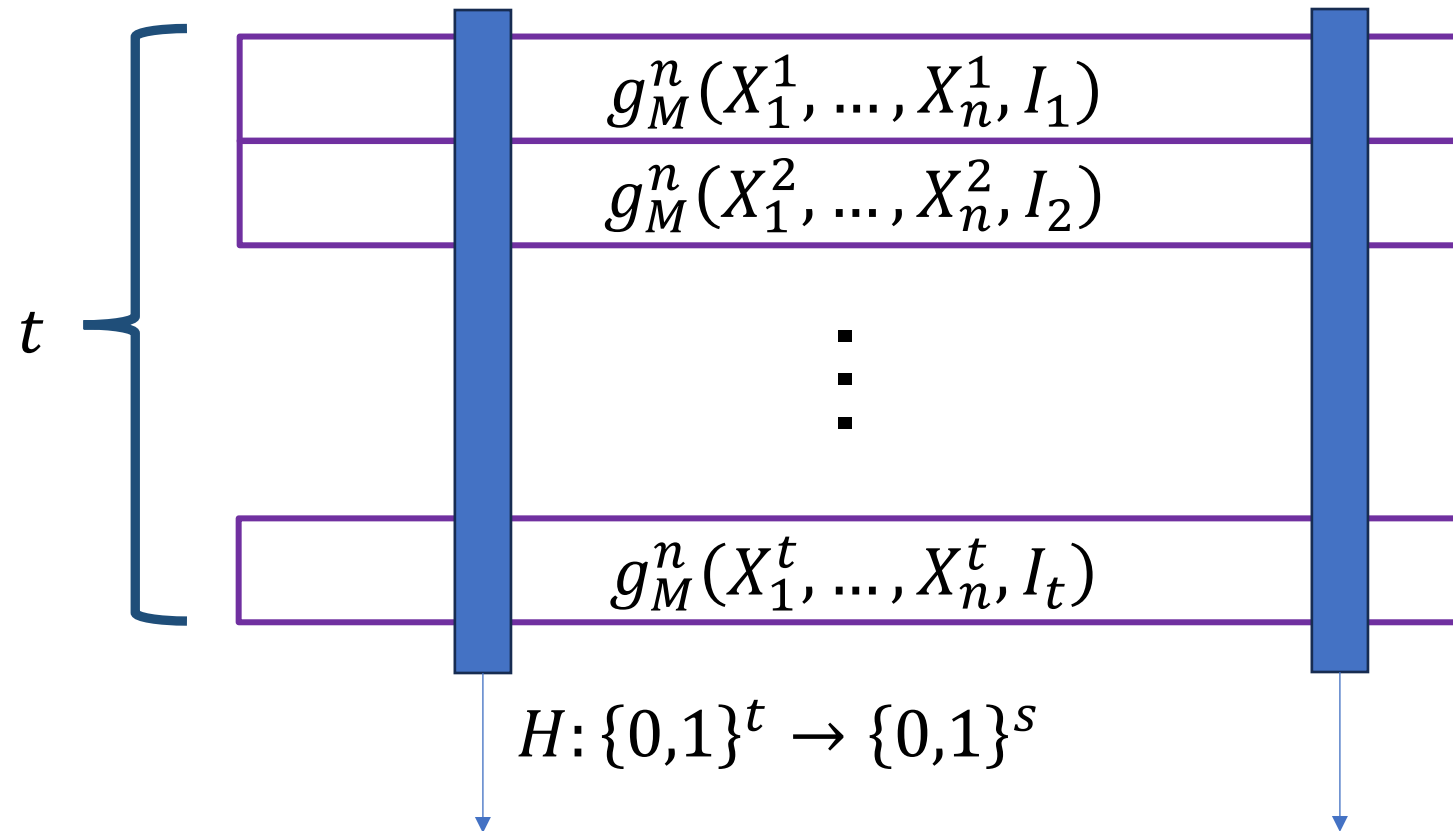
Step 2: Extraction

A diagram illustrating the extraction step. It shows a vertical list of functions enclosed in purple rectangular boxes. The functions are:

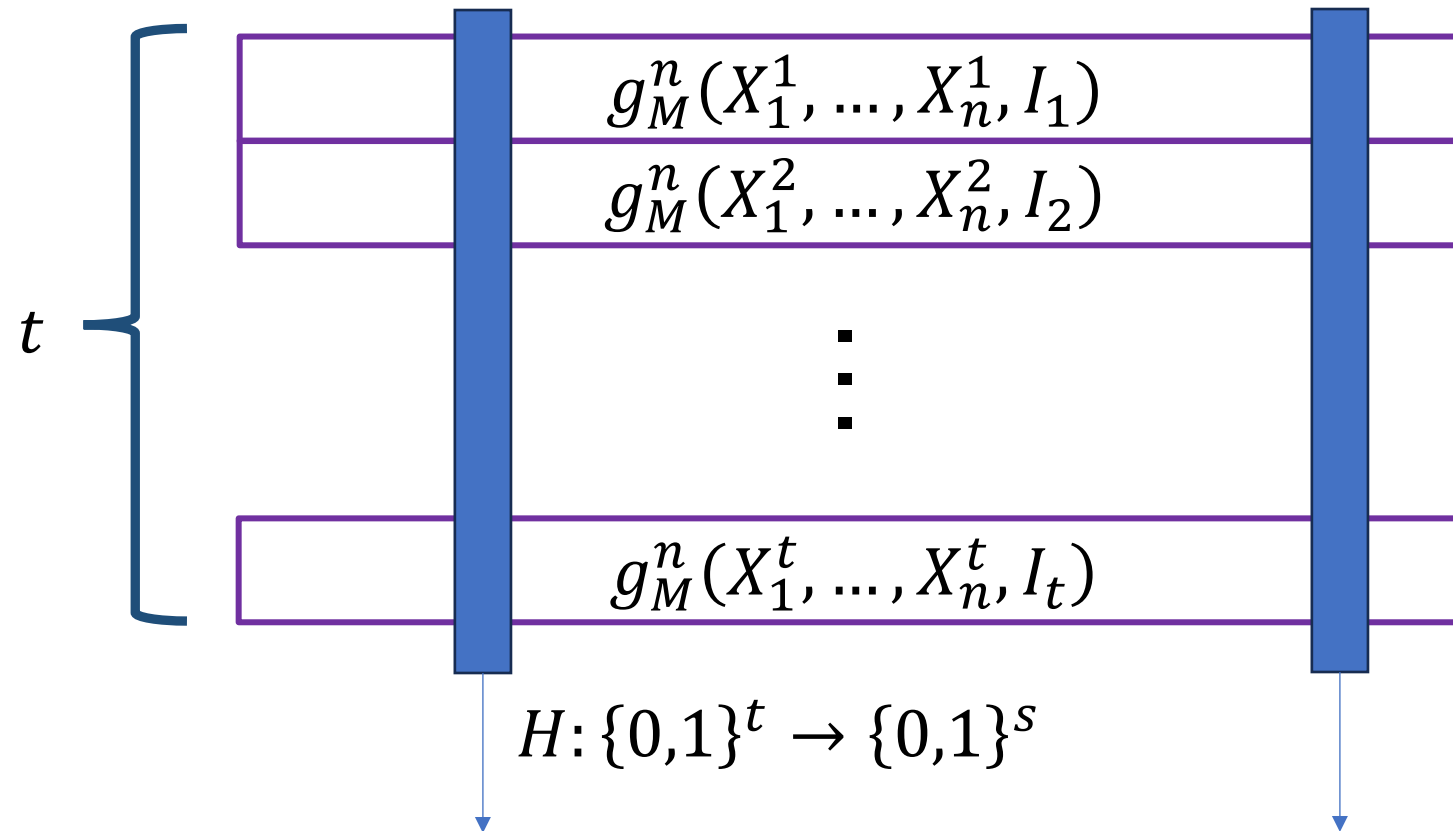
- $g_M^n(X_1^1, \dots, X_n^1, I_1)$
- $g_M^n(X_1^2, \dots, X_n^2, I_2)$
- \vdots
- $g_M^n(X_1^t, \dots, X_n^t, I_t)$

A blue bracket on the left side of the list is labeled with the variable t , indicating that the list represents a sequence of length t .

Step 2: Extraction



Step 2: Extraction



Here we improve parameters over [HRV]

Summary

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Bits Unpredictability

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- Simpler Proof

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OWF \rightarrow Bits Unpredictability

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OWF \rightarrow Bits Unpredictability

- $g_M(X) = M(f(X)), M(X)$

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Bits Unpredictability \rightarrow PRG

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Bits Unpredictability \rightarrow PRG

Question: Simplifying other proofs/constructions

Summary

Bits Unpredictability

- Simpler Proof
- Better Parameters

OWF \rightarrow Bits Unpredictability

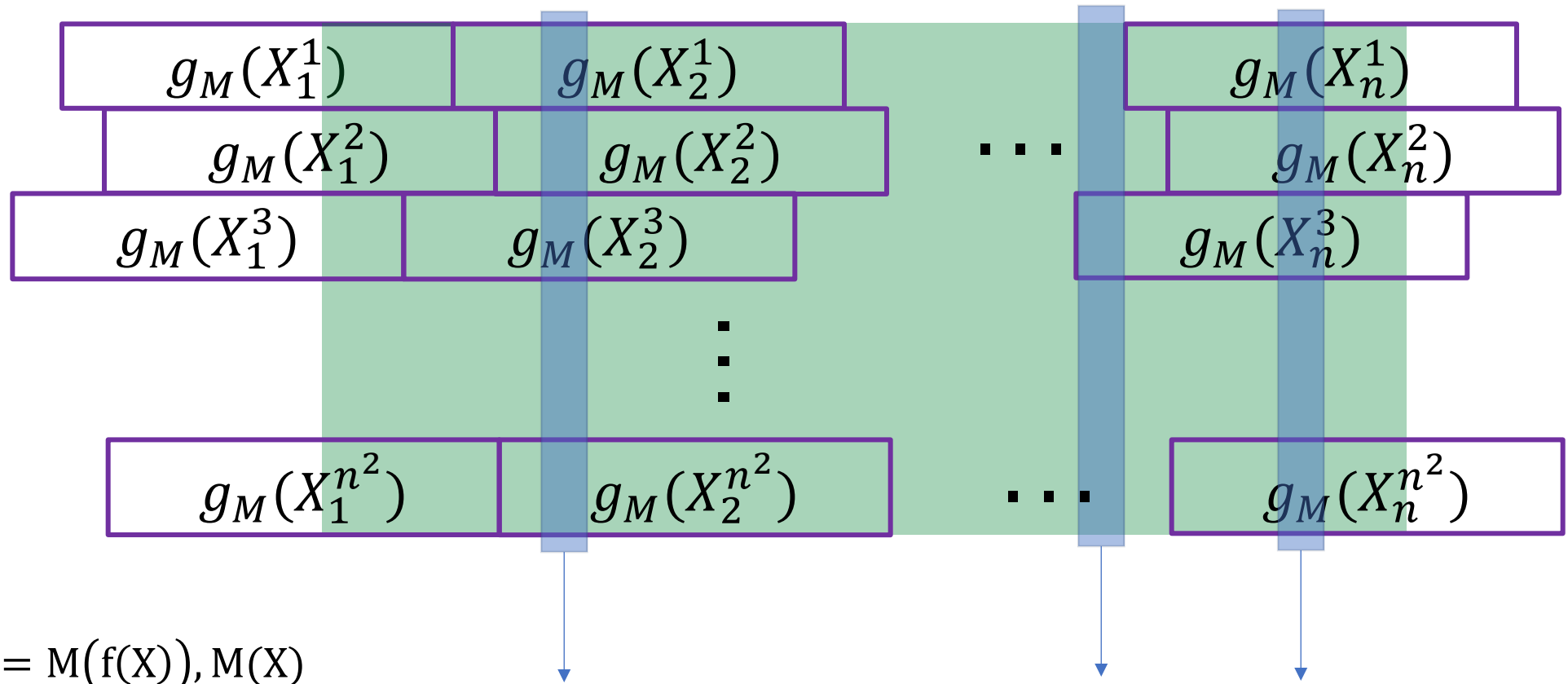
- $g_M(X) = M(f(X)), M(X)$

Bits Unpredictability \rightarrow PRG

Question: Simplifying other proofs/constructions

Thanks!

The Final Construction



$$g_M(X) = M(f(X)), M(X)$$

Bits Unpredictability – Formal Definition

Def:

$g_M: \{0,1\}^n \rightarrow \{0,1\}^m$ has k bit unpredictability if the following holds for every $\epsilon \in 1/\text{poly}$.

For every $x \in \{0,1\}^n$ there exists a set $S_x \subseteq [m]$, such that $|S_x| \geq k$, and,

$$\Pr_{M,X} [P(M, g_M(X)_{<i}) = g_M(X)_i \mid i \in S_x] \leq \frac{1}{2} + \epsilon$$

For any PPT P .

