

# Pseudorandomness

Benny Applebaum

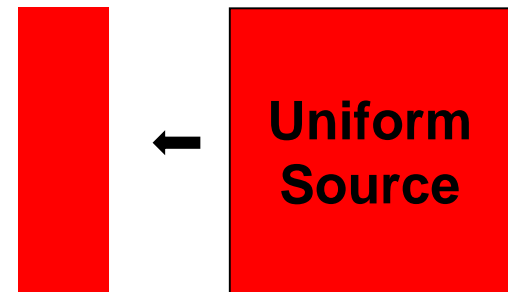
Bar-Ilan Winter School, 2014

# Randomness as a resource

Pure Randomness is

- Valuable, in fact, necessary for crypto
- But typically expensive

m random bits

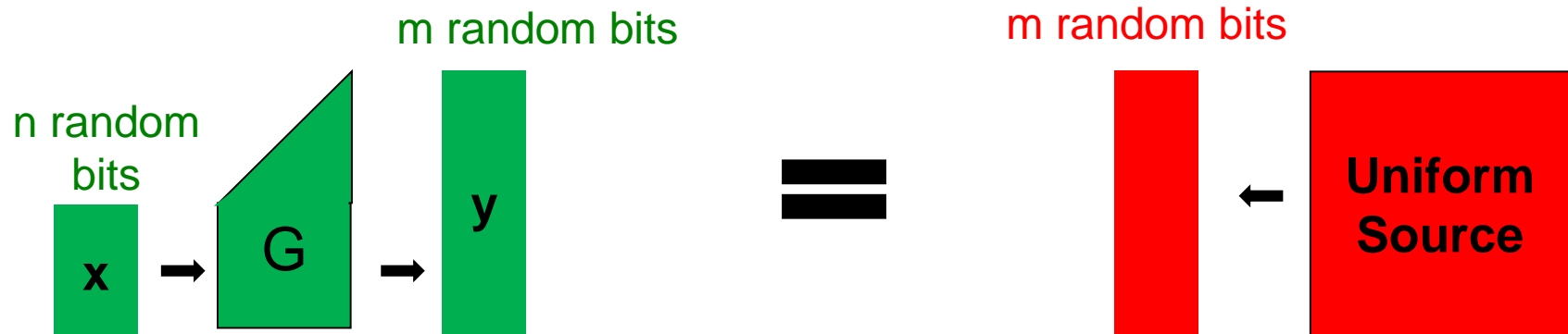


**Goal:** Given a short random string generate a long sequence of random bits?

# Generating randomness

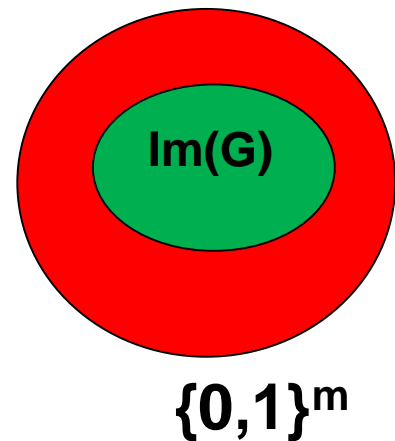
G is a deterministic efficient function

**short** random seed  $\rightarrow$  **long** random string



**Impossible !**

The image of G consists of  $2^n$  strings  
 $\Rightarrow$  doesn't cover all possible  $2^m$  strings

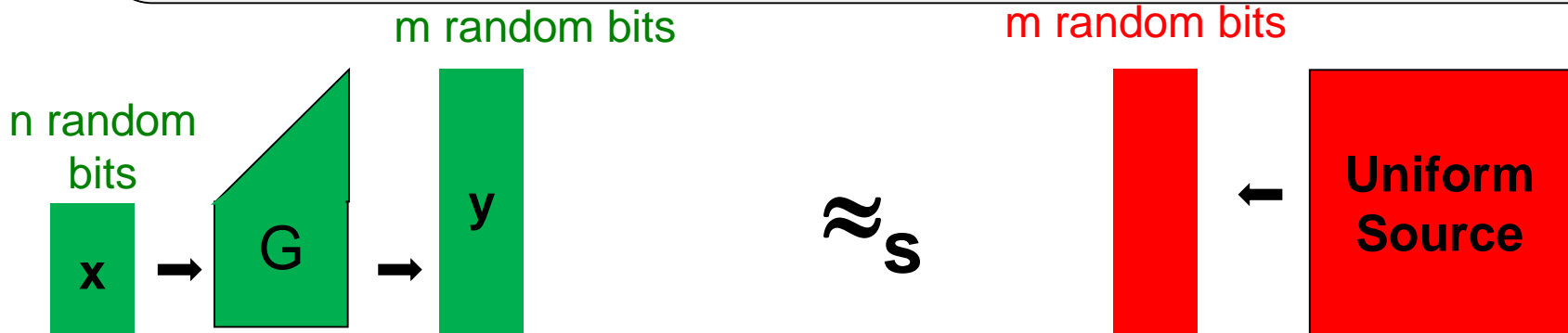


# Generating randomness (relaxation I)

Output is **Statistically-Close** to uniform:

For every event **A**,

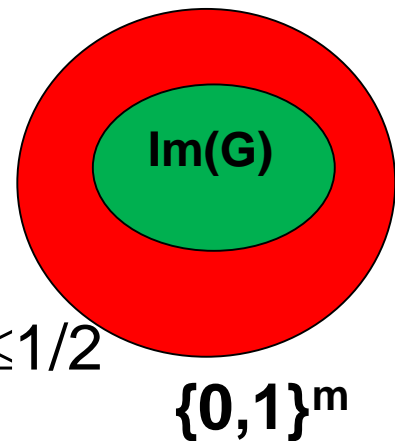
$$\Pr_x[A(G(x))] = \Pr[A(\text{Uniform})] \pm \text{negligible}(n)$$



**Still Impossible !**

Let  $A(y)$  be the event  $y \in \text{Im}(G)$

Then  $\Pr[A(G(x))] = 1$  but  $\Pr[A(\text{uniform})] \leq 2^n/2^m \leq 1/2$

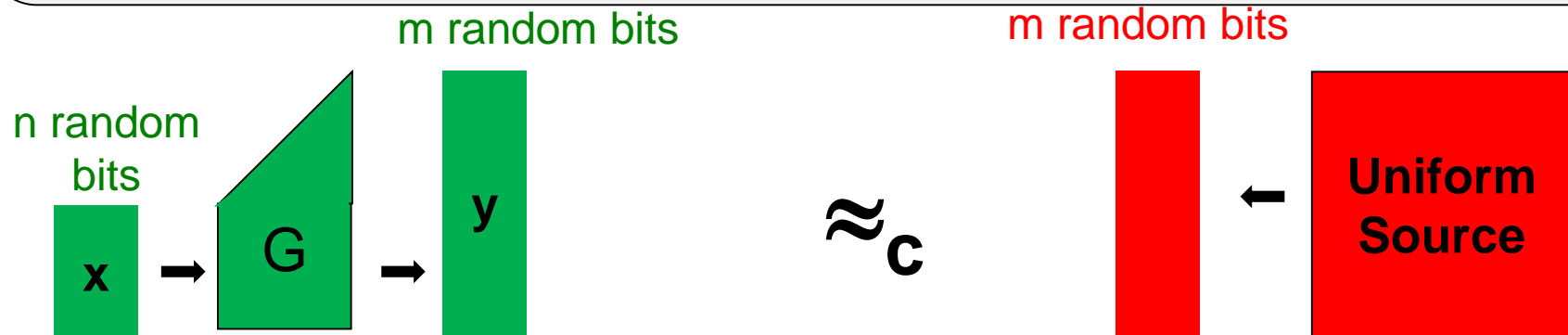


# Generating randomness (relaxation II)

Output is **Computationally-Close** to uniform (**pseudorandom**):

For every **efficiently computable** event **A**,

$$\Pr_x[A(G(x))] = \Pr[A(\text{Uniform})] \pm \text{negligible}$$



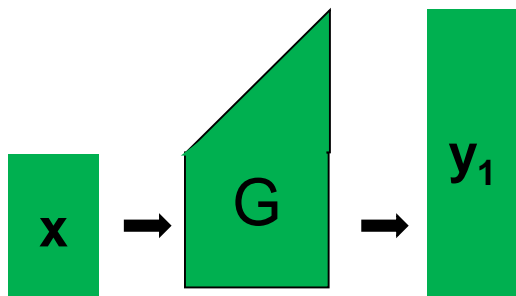
## Observations:

- Strict relaxation of statistical closeness
- Must be computationally hard to decide if  $y \in \text{Image}(G)$
- In fact,  $G$  must be one-way (Exercise)
- WLOG, require  $\Pr_x[A(G(x))] - \Pr[A(\text{Uniform})] < \text{neg}$

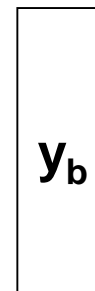
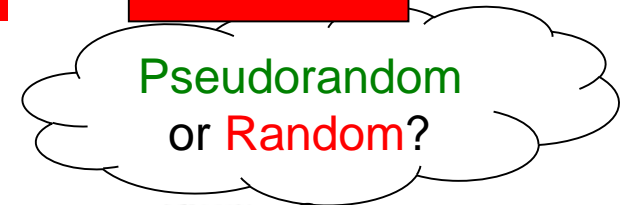
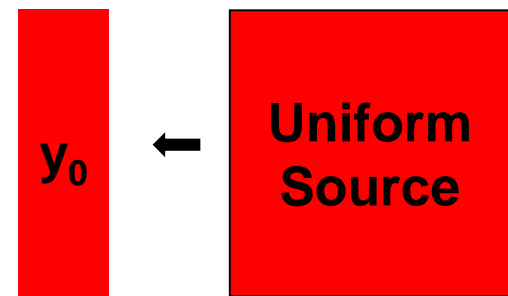
# Alternative view: Indistinguishability

- The adversary **A** is given  $y_b$  where  $b \leftarrow \{0,1\}$
- **A** outputs a guess bit  $b'$  and **wins** if  $b'=b$

**Claim:**  $G$  is pseudorandom iff  $\Pr[\text{win}] < 1/2 + \text{neg}$



$\approx_c$

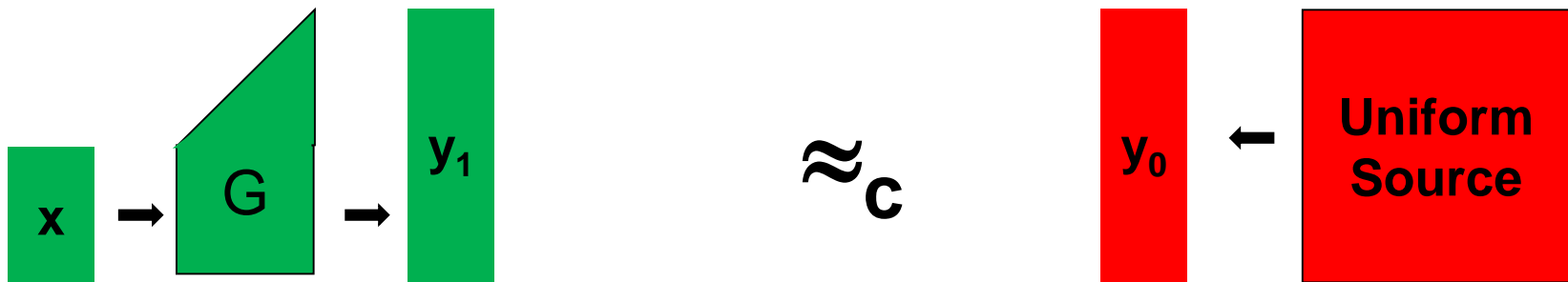


Poly-time adversary **A**

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$$\begin{aligned}
 \Pr[\text{win}] &= \Pr[A(y_1)=1] * \Pr[b=1] & + & \Pr[A(y_0)=0] * \Pr[b=0] \\
 &= \frac{1}{2} (\Pr[(A(y_1)=1)] + \Pr[A(y_0)=0]) \\
 &= \frac{1}{2} (\Pr_x[A(\text{PRG}(x))] + 1 - \Pr[A(U_m)]) \\
 &= \frac{1}{2} + \frac{1}{2} (\Pr_x[A(\text{PRG}(x))] - \Pr[A(U_m)]) < \frac{1}{2} + \text{neg}
 \end{aligned}$$

# Properties



# Pseudorandomness is preserved under multiple samples

Proof by reduction to a single instance.

**G(x1)**

**G(x2)**

**G(x3)**

**Uniform1**

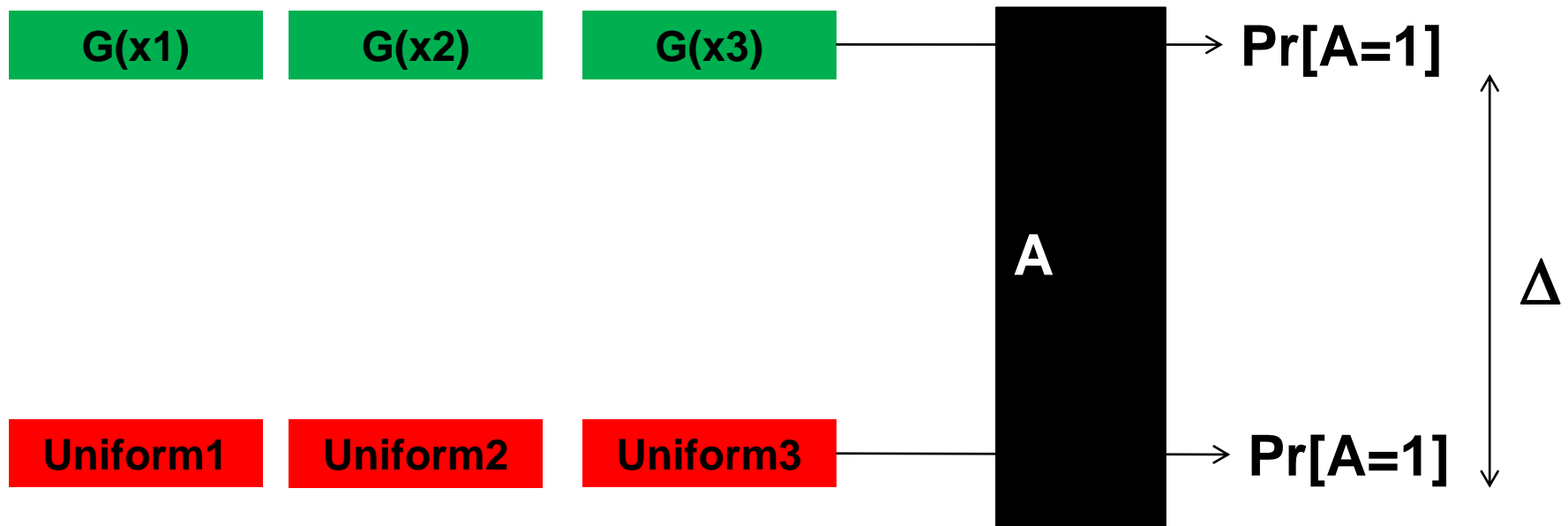
**Uniform2**

**Uniform3**

# Pseudorandomness is preserved under multiple samples

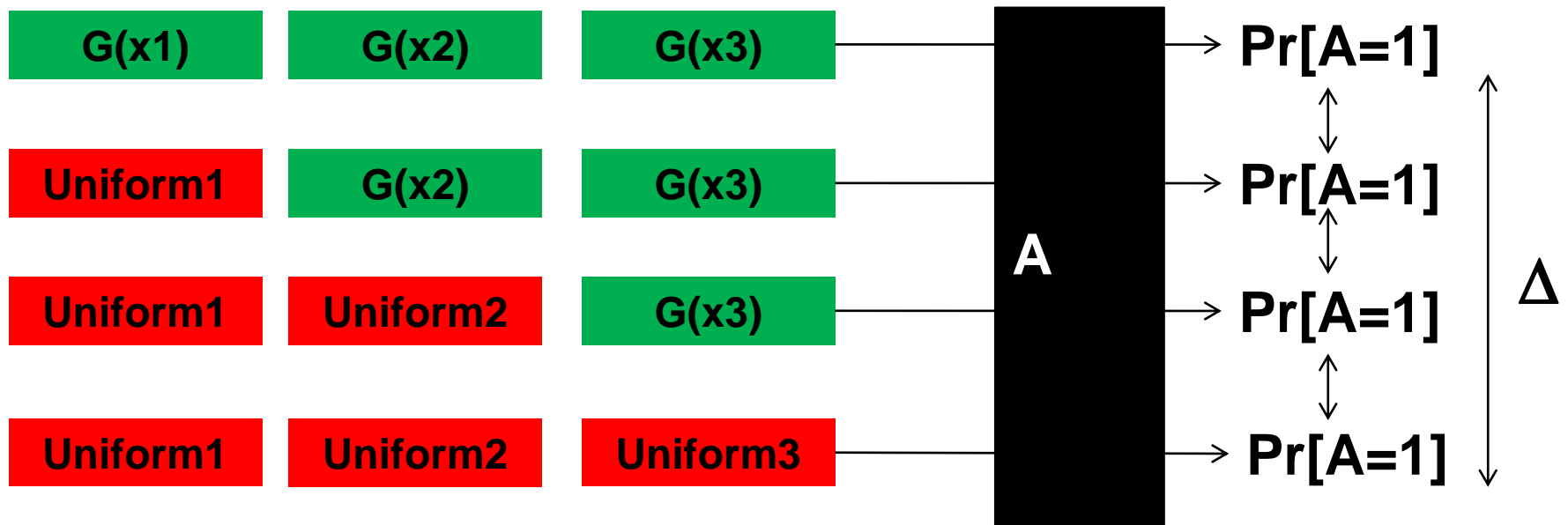
Assume a multiple-samples adversary **A**

**Goal:** Construct a single-instance adversary **B**



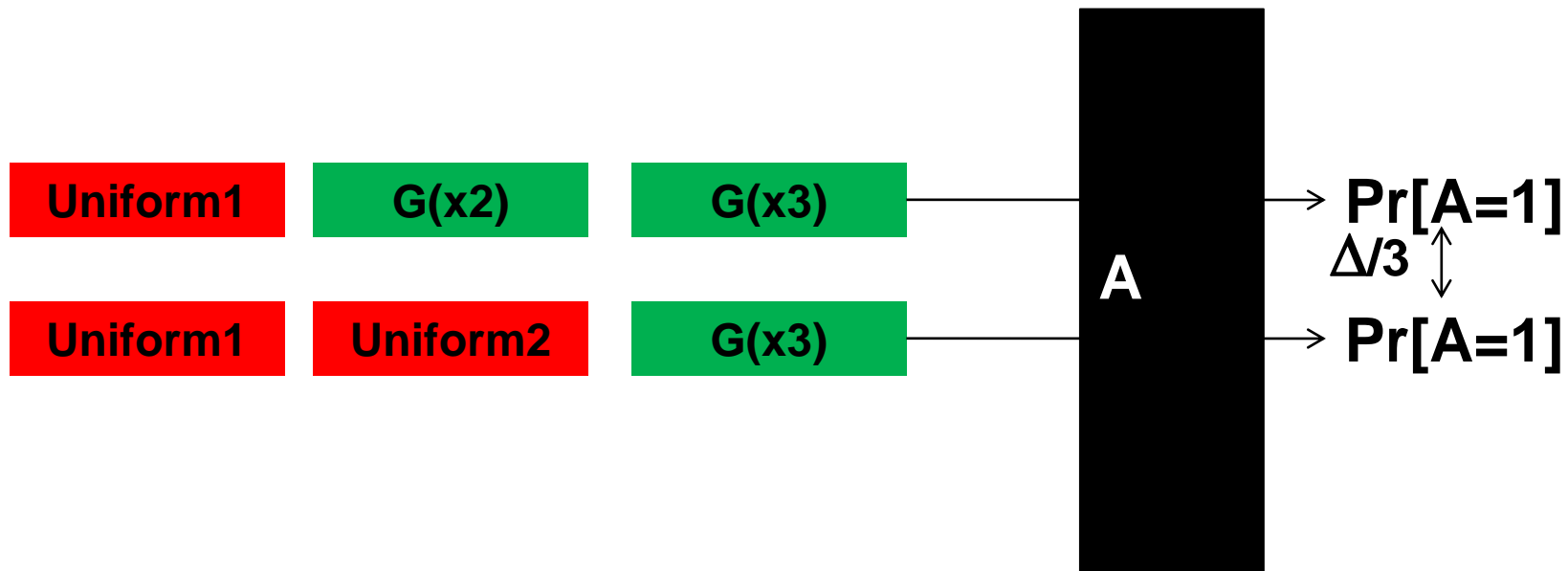
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There must be two neighboring hybrids with gap  $> \Delta/3$



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There must be two neighboring hybrids with gap  $> \Delta/3$



# Pseudorandomness is preserved under multiple samples

$B(y)$ : Plant  $y$  in the changing point and call  $A$ .

$$\Rightarrow \Pr_x[B(\text{PRG}(x))=1] - \Pr[B(\text{Random})=1] > \Delta/3$$

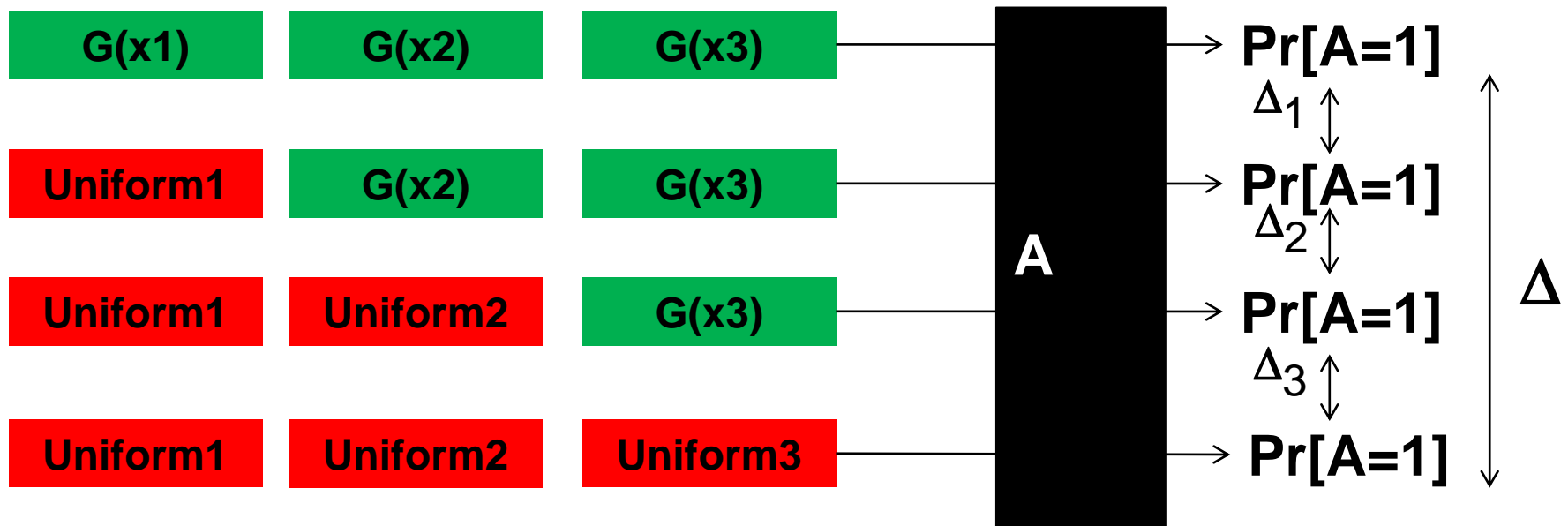
$\Rightarrow$  Contradicting the security of the PRG!



# How to find a good pair of hybrids ?

Observation: the **average gap**  $\sum \Delta_i / t \geq \Delta / t$

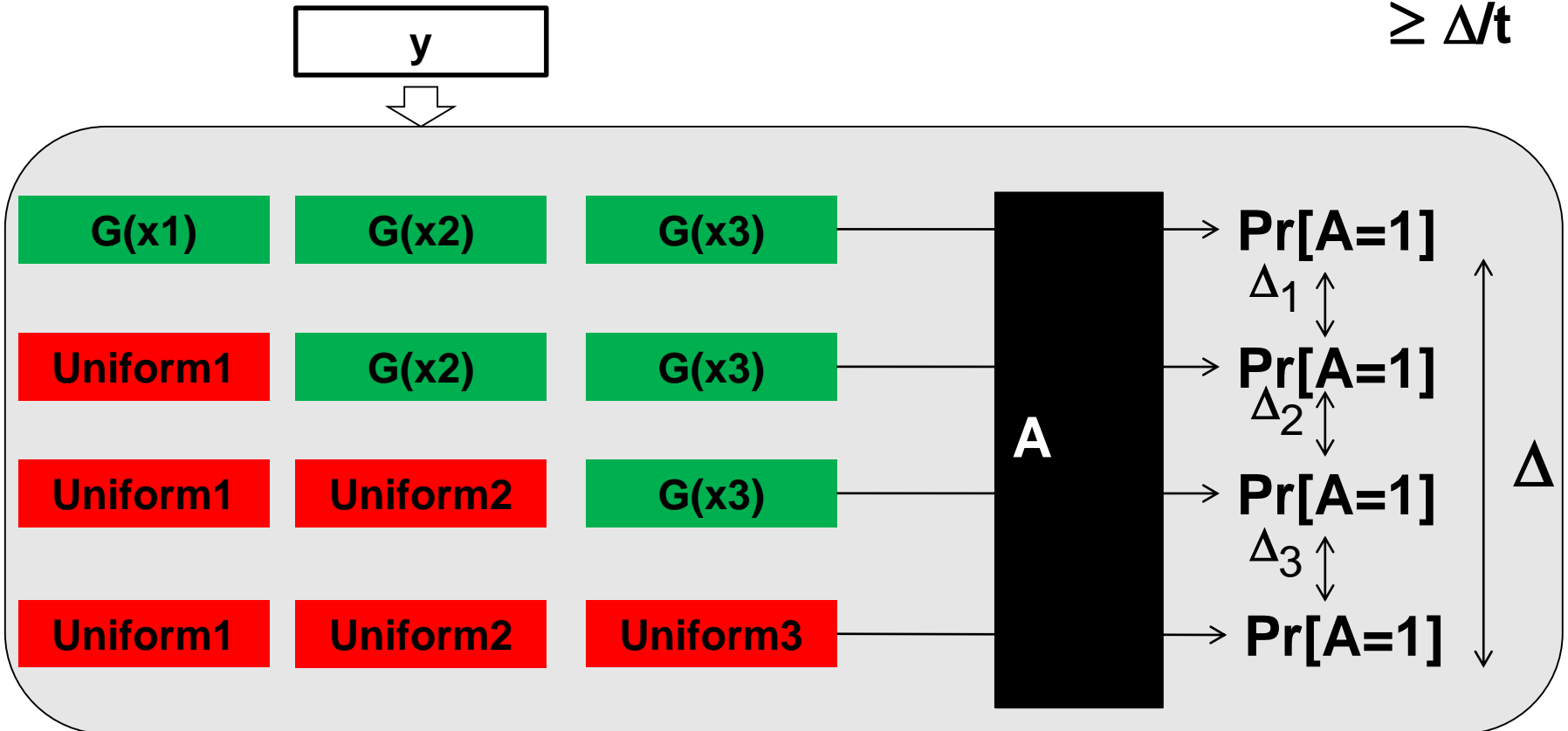
**Idea:** Let **B** Choose a random pair



# How to find good pair of hybrids ?

$B(y)$ : Choose a **random** hybrid, plant  $y$  in the changing point and call  $A$

**Ex:** Prove  $\Pr_x[B(\text{PRG}(x))=1] - \Pr[B(\text{Random})=1] = \sum \Delta_i / t \geq \Delta / t$



# The Hybrid method

**Goal:**  $X \approx Y$  for some complicated distributions

- Define a sequence of **poly**-many hybrids  $H_0, \dots, H_t$
- $H_0 = X$  and  $H_t = Y$
- $H_i \approx_c H_{i+1}$  typically by simple argument
- Conclude that  $X = H_0 \approx_c H_t = Y$

An extremely powerful technique in crypto



# Formal Definitions

- Let  $\mathbf{X}$  and  $\mathbf{Y}$  be a probability distributions over  $\{0,1\}^n$
- Let  $\mathbf{A}:\{0,1\}^n\rightarrow\{0,1\}$  be an adversary (distinguisher)

The **distinguishing gap** is defined by

$$\Delta_{\mathbf{A}}(\mathbf{X},\mathbf{Y}) = |\Pr[\mathbf{A}(\mathbf{X})=1]-\Pr[\mathbf{A}(\mathbf{Y})=1]|$$

A pair of distribution ensembles  $\mathbf{X}=\{\mathbf{X}_n\}$  and  $\mathbf{Y}=\{\mathbf{Y}_n\}$  are **computationally indistinguishable**,  $\mathbf{X}\approx_c\mathbf{Y}$ , if for every PPT  $\mathbf{A}$ ,

$$\Delta_{\mathbf{A}}(\mathbf{X}_n,\mathbf{Y}_n) < \text{neg}(n).$$

A deterministic efficient function  $G$  is a **PRG** if:

1.  $G$  **expands**  $n$ -bits to  $m$ -bits where  $m(n)>n$ .
2.  $\{\mathbf{G}(\mathbf{U}_n)\} \approx_c \{\mathbf{U}_{m(n)}\}$

# Useful facts

Indistinguishability behaves like a distance

- (Transitive) If  $\mathbf{X} \approx_c \mathbf{Y}$  and  $\mathbf{Y} \approx_c \mathbf{Z}$  then  $\mathbf{X} \approx_c \mathbf{Z}$

**Proof:**  $\Delta_A(\mathbf{X}, \mathbf{Z}) \leq \Delta_A(\mathbf{X}, \mathbf{Y}) + \Delta_A(\mathbf{Y}, \mathbf{Z})$ , for every  $\mathbf{A}$

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- (Transitive) If  $\mathbf{X} \approx_c \mathbf{Y}$  and  $\mathbf{Y} \approx_c \mathbf{Z}$  then  $\mathbf{X} \approx_c \mathbf{Z}$
- (Preserved under efficient computations):  
If  $\mathbf{X} \approx_c \mathbf{Y}$  then  $\mathbf{F}(\mathbf{X}) \approx_c \mathbf{F}(\mathbf{Y})$  where  $\mathbf{F}$  is PPT

**Proof:** (contra positive)

Assume  $\Delta_{\mathbf{A}}(\mathbf{F}(\mathbf{X}), \mathbf{F}(\mathbf{Y}))$  is non-negligible for some PPT  $\mathbf{A}$

Define a new PPT adversary  $\mathbf{B} = \mathbf{A} \circ \mathbf{F}$  then

$\Delta_{\mathbf{B}}(\mathbf{X}, \mathbf{Y}) = \Delta_{\mathbf{A}}(\mathbf{F}(\mathbf{X}), \mathbf{F}(\mathbf{Y}))$  is non-negligible  $\Rightarrow$  contradiction.

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- (Transitive) If  $\mathbf{X} \approx_c \mathbf{Y}$  and  $\mathbf{Y} \approx_c \mathbf{Z}$  then  $\mathbf{X} \approx_c \mathbf{Z}$
- (Preserved under efficient computations):  
If  $\mathbf{X} \approx_c \mathbf{Y}$  then  $\mathbf{F}(\mathbf{X}) \approx_c \mathbf{F}(\mathbf{Y})$  where  $\mathbf{F}$  is PPT
- (Preserved under ind. samples)  
For efficiently samplable  $\mathbf{X}, \mathbf{X}', \mathbf{Y}, \mathbf{Y}'$  If  $\mathbf{X} \approx_c \mathbf{X}'$  and  $\mathbf{Y} \approx_c \mathbf{Y}'$   
then  $(\mathbf{X}, \mathbf{Y}) \approx_c (\mathbf{X}', \mathbf{Y}')$

**Pf:** Hybrid argument (as we saw)

# Constructions

# PRGs from One-Way Functions

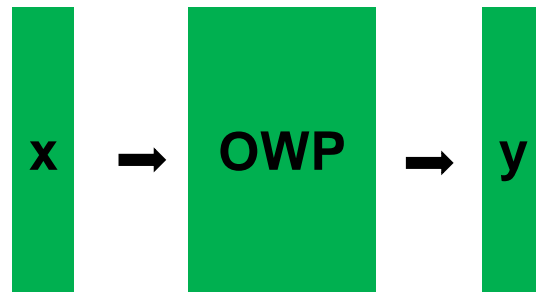
**Thm.** [Hastad-Impagliazzo-Levin-Luby 1990]

**If one-way functions exist, then there are pseudorandom generators.**

- Recall that the converse direction also holds.
- Fundamental theorem: “PRGs are feasible”
- Complicated and beautiful proof with many important concepts (randomness extractors, pseudoentropy,...).
- We will see a proof of a weaker theorem that builds PRGs from **one-way permutations**.

# PRGs from One-Way Permutations

Recall that a **one way permutation** is a **bijection** over  $\{0,1\}^n$  which is **easy-to-compute** but **hard-to-invert**



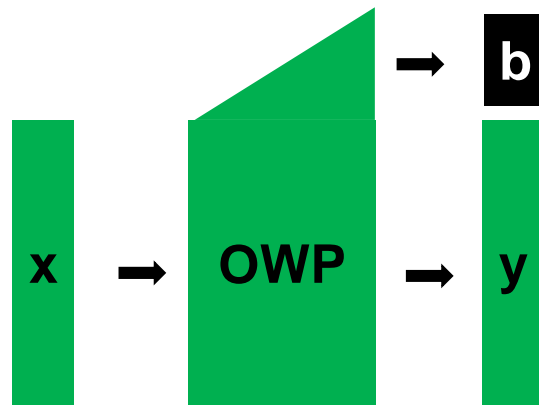
Good start:  $y$  is truly uniform

How to generate an **extra pseudorandom bit**?

# PRGs from One-Way Permutations

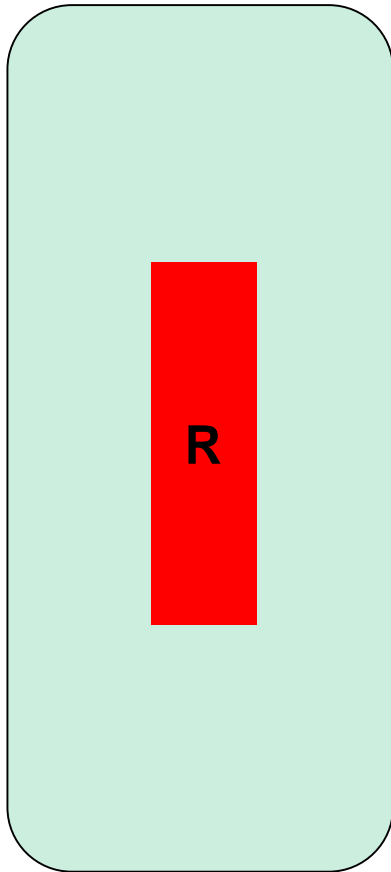
**Thm.** Let  $b(x)$  be a hard-core bit of the OWP.

**Then the mapping  $x \rightarrow (\text{OWP}(x), b(x))$  is PRG**

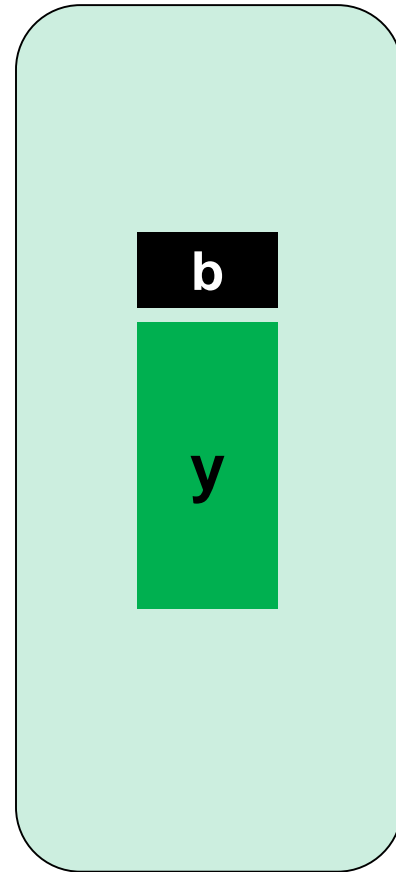




# Goal: Prove indistinguishability

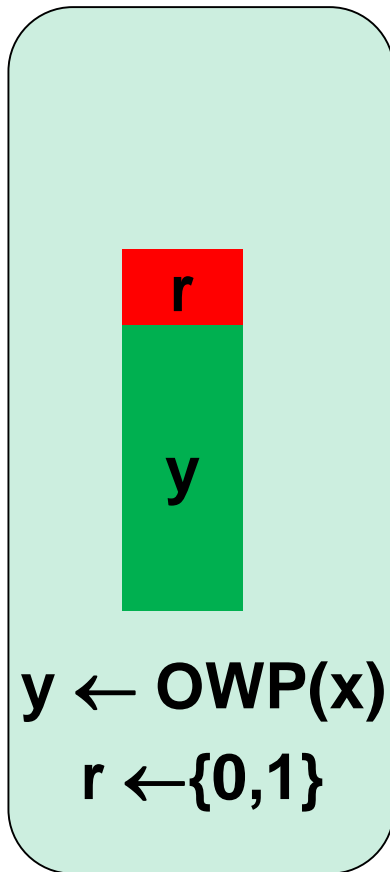


**Random**

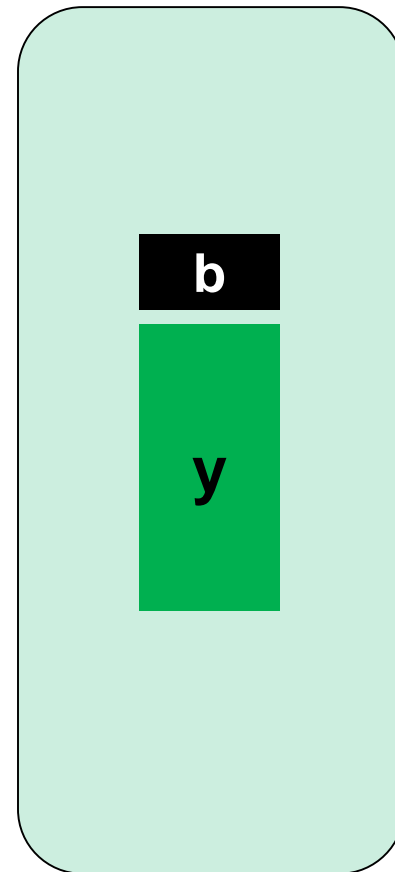


**Pseudorandom**

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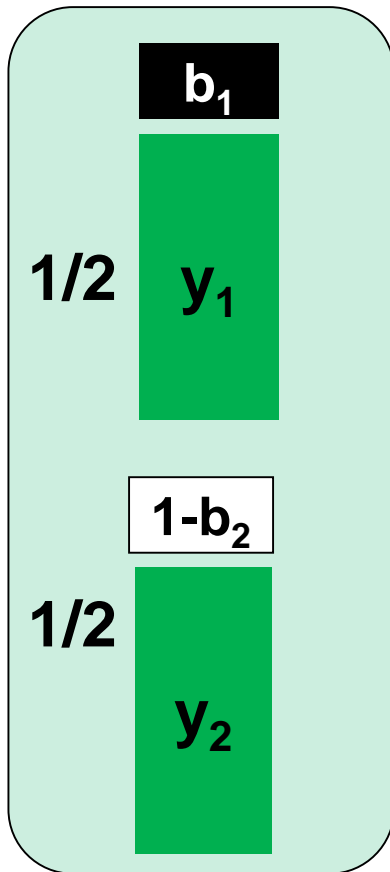


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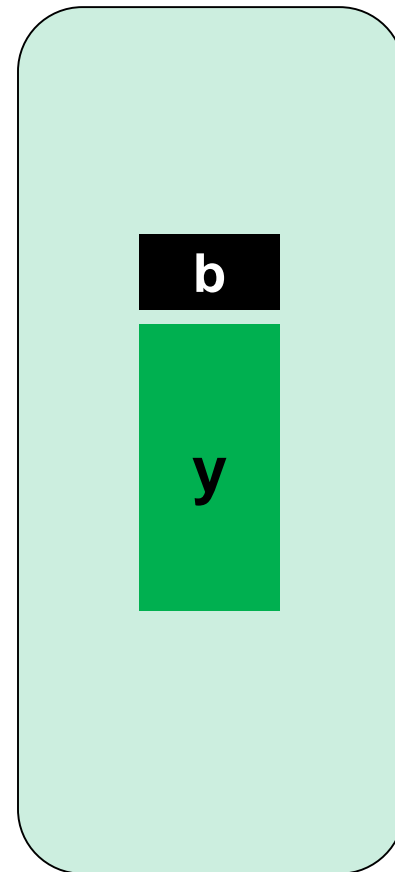


**Pseudorandom**

# Goal: Prove indistinguishability



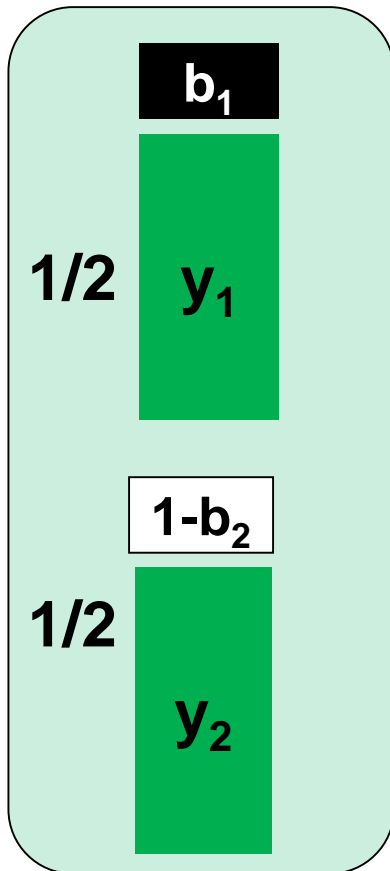
**Random**



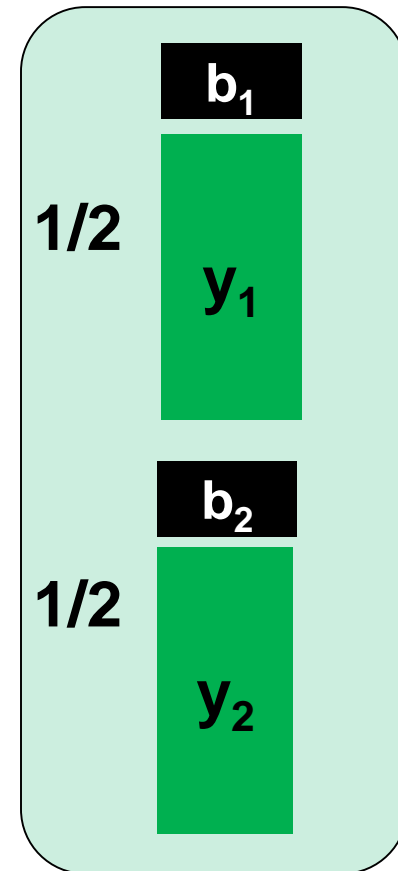
**Pseudorandom**

# Goal: Prove indistinguishability

By “**useful fact**” it suffices to prove indistinguishability for



**Random**

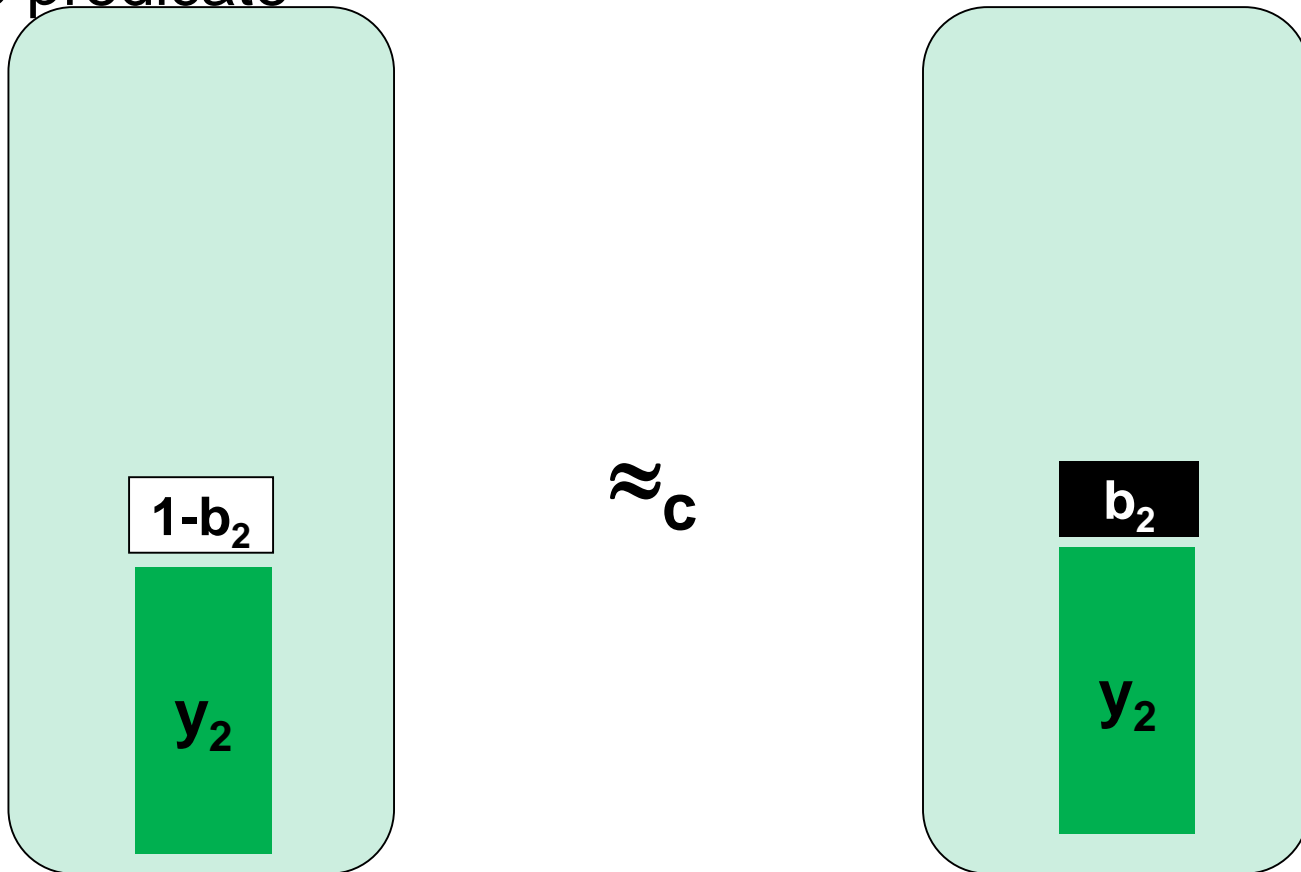


**Pseudorandom**

# Goal: Prove indistinguishability

By “**useful fact**” it suffices to prove indistinguishability for

Indistinguishability follows immediately from the security of hardcore predicate

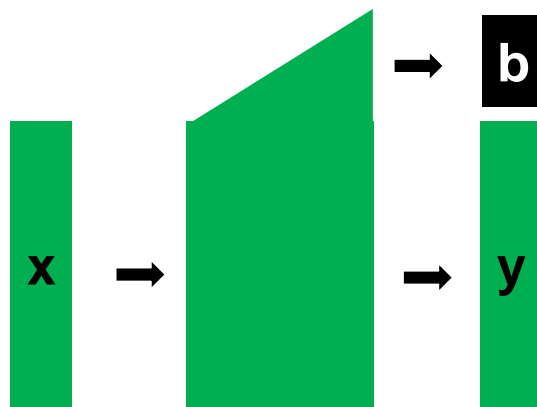


# Expanding the Stretch

# The length matters...

- PRG which stretches its input by a single-bit is not very useful...
- Can we expand the stretch?

**Thm.** A **PRG**: $\{0,1\}^n \rightarrow \{0,1\}^{n+1}$  can be transformed into **PRG**: $\{0,1\}^n \rightarrow \{0,1\}^{m(n)}$  for an arbitrary polynomial  $m(n)$

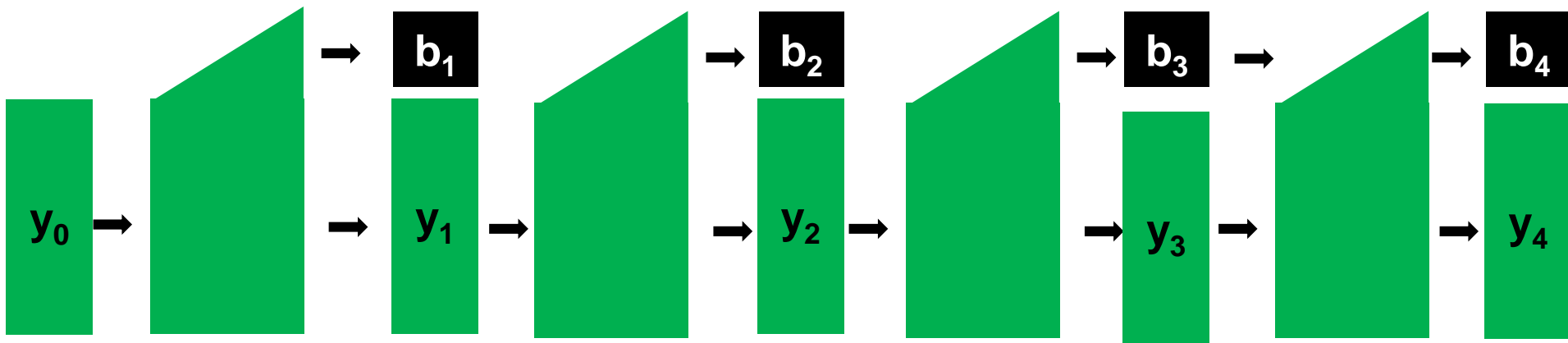


# Expanding the stretch

NewPRG( $y_0$ )

- For  $i=0$  to  $m$ :
  - $(y_{i+1}, b_{i+1}) = \text{PRG}(y_i)$

Output  $b_1, \dots, b_m$





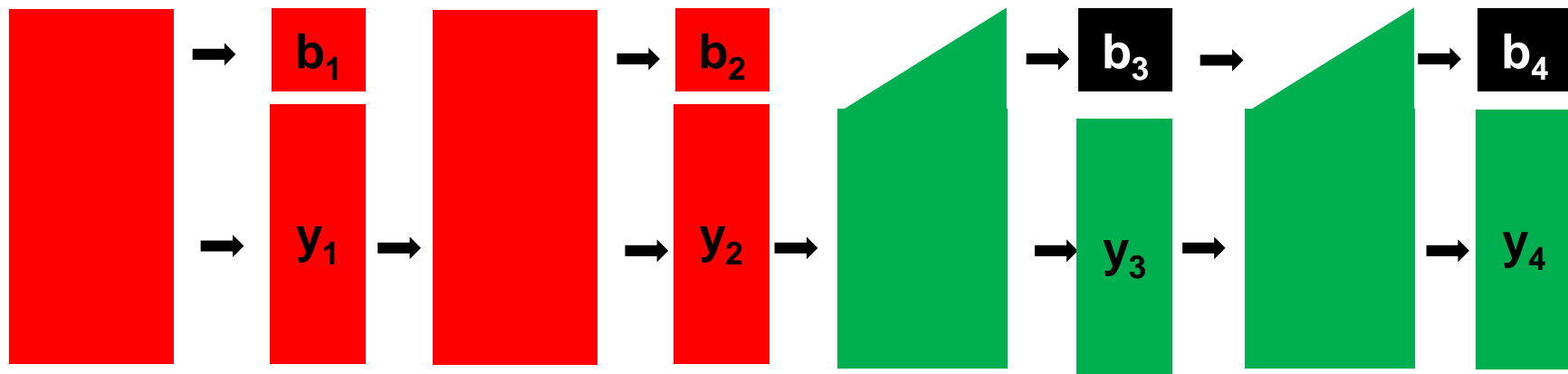
# Proof via Hybrid Argument

Hybrid  $H_k$

- For  $i=0$  to  $m$ :

$$- (y_{i+1}, b_{i+1}) = \begin{cases} \text{Random} & \text{if } i \leq k \\ \text{PRG}(y_i) & \text{if } i > k \end{cases}$$

Output  $b_1, \dots, b_m$

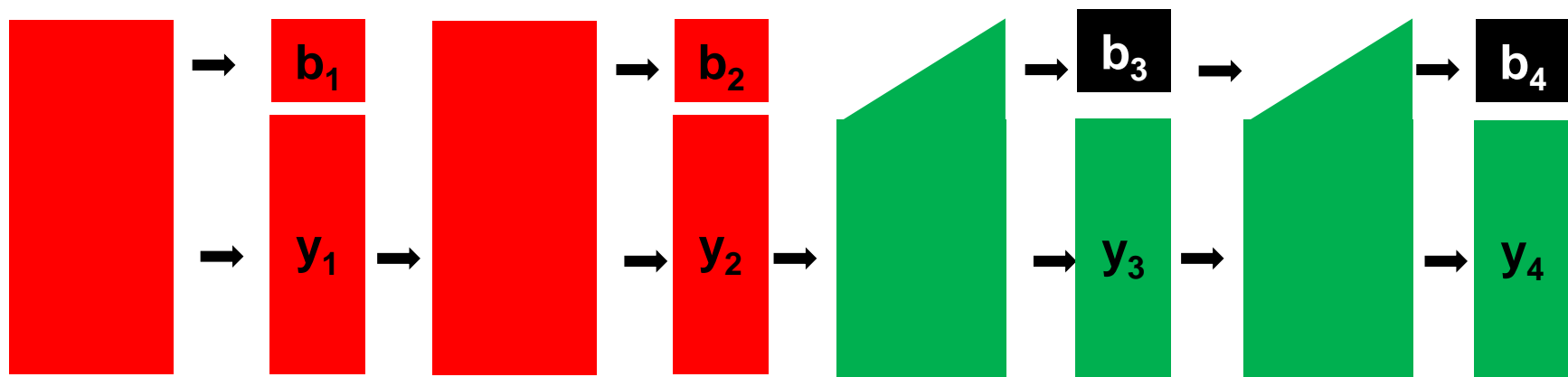


# Proof via Hybrid Argument

$H_0 = \text{NewPRG}$  and  $H_m = \text{Random}$

Assume  $\mathbf{A}(b_1, \dots, b_m)$  distinguishes  $H_0$  from  $H_m$  with gap  $\Delta$

Transform  $\mathbf{A}$  into a distinguisher  $\mathbf{B}(y, b)$  for original PRG



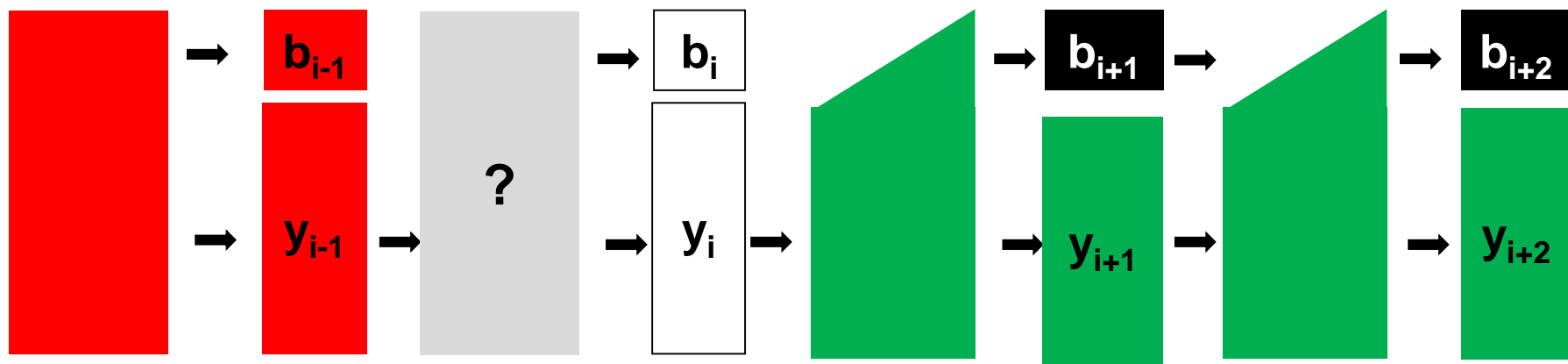
# Breaking the original PRG

**B** puts challenge  $(y,b)$  in a random location  $i$  & calls **A**

**Analysis:** If  $(y,b)$  pseudorandom  $\Pr[B=1]=\Pr[A(H_{i-1})=1]$

If  $(y,b)$  is random  $\Pr[B=1]=\Pr[A(H_i)=1]$

$\Rightarrow$  B's gap  $1/m \sum (\Pr[A(H_i)] - \Pr[A(H_{i-1})]) > \Delta/m$



# Summary

**PRGs** generate long strings which are **indistinguishable** from **random** by **efficient** adversaries

- Extremely useful in crypto and complexity
- Can be constructed from any one-way function
- In practice, there are very efficient candidates with long stretch
- Computational Indistinguishability is a useful abstract notion with many friendly properties



Poly-time adversary **A**