

Stream ciphers

The One Time Pad

This slide is made based the online course of Cryptography by Dan Boneh

Symmetric Ciphers: definition

Def: a **cipher** defined over (K, M, C)

is a pair of “efficient” algs (E, D) where

$$E : \mathcal{K} \times \mathcal{M} \rightarrow \mathcal{C} \quad D : \mathcal{K} \times \mathcal{C} \rightarrow \mathcal{M}$$

for all keys k and all messages m , we have

$$D(k, E(k, m)) = m$$

- E is often randomized. D is always deterministic.

The One Time Pad

(Vernam 1917)

First example of a “secure” cipher

$$M = C = \{0,1\}^n, \quad K = \{0,1\}^n$$

key = (random bit string as long the message)

The One Time Pad

(Vernam 1917)

$$E(k, m) := k \oplus m$$

$$D(k, c) := k \oplus c$$

msg: 0 1 1 0 1 1 1

key: 1 0 1 1 0 1 0

\oplus

CT:

Indeed, we have

$$D(k, E(k, m)) = D(k, k \oplus m) = k \oplus (k \oplus m) = (k \oplus k) \oplus m = 0^L \oplus m = m$$

You are given a message (m) and its OTP encryption (c).

Can you compute the OTP key from m and c ?

No, I cannot compute the key.

Yes, the key is $k = m \oplus c$.

I can only compute half the bits of the key.

Yes, the key is $k = m \oplus m$.

The One Time Pad

(Vernam 1917)

Very fast enc/dec !!

... but long keys (as long as plaintext)

Is the OTP secure? What is a secure cipher?

What is a secure cipher?

Attacker's abilities: **CT only attack** (for now)

Possible security requirements:

attempt #1: **attacker cannot recover secret key**

$E(k, m) = m$ would be secure

attempt #2: **attacker cannot recover all of plaintext**

$E(k, m_0 || m_1) = m_0 || k \oplus m_1$ would be secure

Shannon's idea:

CT should reveal no "info" about PT

Information Theoretic Security

(Shannon 1949)

Definition (**perfect security**). *Let $\mathcal{E} = (E, D)$ be a Shannon cipher defined over $(\mathcal{K}, \mathcal{M}, \mathcal{C})$. Consider a probabilistic experiment in which the random variable \mathbf{k} is uniformly distributed over \mathcal{K} . If for all $m_0, m_1 \in \mathcal{M}$, and all $c \in \mathcal{C}$, we have*

$$\Pr[E(\mathbf{k}, m_0) = c] = \Pr[E(\mathbf{k}, m_1) = c],$$

*then we say that \mathcal{E} is a **perfectly secure** Shannon cipher.*

Information Theoretic Security

Def: A cipher (E,D) over (K,M,C) has **perfect secrecy** if

$$\forall m_0, m_1 \in M \quad (|m_0| = |m_1|) \quad \text{and} \quad \forall c \in C$$

$$Pr[E(k,m_0)=c] = Pr[E(k,m_1)=c] \quad \text{where } k \xleftarrow{R} K$$

1. Given CT cannot tell if message is m_0 or m_1 (For all m_0 and m_1)
2. Most powerful adversary learns nothing about Plaintext from ciphertext
3. No Ciphertext only attack

Lemma: OTP has perfect secrecy.

Proof: $\forall m, c: \Pr[E(k, m) = c] = \frac{\# \text{ keys } k \in K \text{ s.t. } E(k, m) = c}{|K|}$

So: if $\forall m, c: \exists \Pr[k \in K: E(k, m) = c] = \text{const.}$

 Cipher has perfect secrecy.

Let $m \in \mathcal{M}$ and $c \in \mathcal{C}$.

How many OTP keys map \mathbf{m} to \mathbf{c} ?

None

1

2

Depends on \mathbf{m}

Lemma: OTP has perfect secrecy.

Proof:

For OTP: $\forall m, c: \text{if } E(k, m) = c$

$$k \oplus m = c \quad \longrightarrow \quad k = c \oplus m$$

$$\exists \Pr[k \in K: E(k, m) = c] = 1/|K|$$

OTP has perfect secrecy.

The bad news ...

Thm: perfect secrecy $\Rightarrow |\mathcal{K}| \geq |\mathcal{M}|$

Perfect secrecy  Key length \geq message length

Hard to apply in practice!

End of Segment

Stream ciphers

Pseudorandom
Generators

Review

Cipher over (K, M, C) : a pair of “efficient” algs (E, D) s.t.

$$\forall m \in M, k \in K: D(k, E(k, m)) = m$$

Weak ciphers: subs. cipher, Vigenere, ...

A good cipher: **OTP** $M=C=K=\{0,1\}^n$

$$E(k, m) = k \oplus m, \quad D(k, c) = k \oplus c$$

Lemma: OTP has perfect secrecy (i.e. no CT only attacks)

Bad news: perfect-secrecy \Rightarrow key-len \geq msg-len

Stream Ciphers: making OTP practical

idea: replace “random” key by “pseudorandom” key

PRG is a function $G: \{0, 1\}^s \rightarrow \{0, 1\}^n$, $n \gg s$



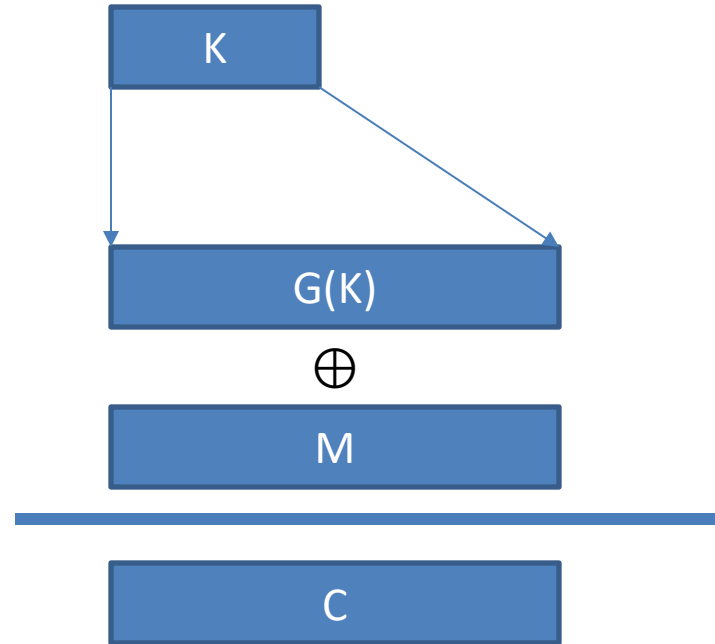
Seed space

Efficiently computable by a deterministic algorithm

Stream Ciphers: making OTP practical

$$C = E(K, m) = m \oplus G(k)$$

$$D(k, C) = C \oplus G(k)$$



Can a stream cipher have perfect secrecy?

- ☐ Yes, if the PRG is really “secure”
- ☐ No, there are no ciphers with perfect secrecy
- ☐ Yes, every cipher has perfect secrecy
- ☐ No, since the key is shorter than the message

Stream Ciphers: making OTP practical

Stream ciphers cannot have perfect secrecy !!

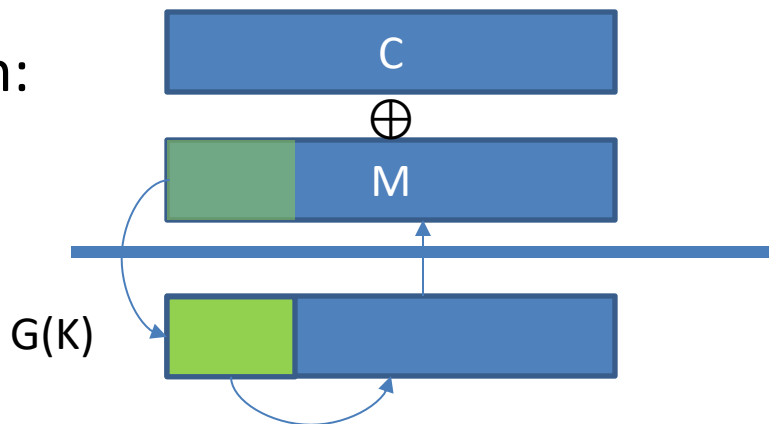
- Need a different definition of security
- Security will depend on specific PRG

PRG must be unpredictable

Suppose PRG is predictable.

$$\exists i: G(k)|_{1,\dots,i} \longrightarrow G(k)|_{i+1,\dots,n}$$

Then:



Even $G(k)|_{1,\dots,i} \longrightarrow G(k)|_{i+1}$ is a problem!

PRG must be unpredictable

We say that $G: K \rightarrow \{0,1\}^n$ is **predictable** if:

\exists "eff" *alg.* A and $\exists 0 \leq i \leq n - 1$

s.t. $\Pr[A(G(k))|_{1,\dots,i} = G(k)|_{i+1}] > \frac{1}{2} + \varepsilon$

for non-negligible ε (e.g. $\varepsilon = 1/2^{30}$)

Def: PRG is **unpredictable** if it is not predictable

$\Rightarrow \forall i$: no "eff" adv. can predict bit $(i+1)$ for "non-neg" ε

Suppose $G:K \rightarrow \{0,1\}^n$ is such that for all k : **$\text{XOR}(G(k)) = 1$**

Is G predictable ??

Yes, given the first bit I can predict the second

No, G is unpredictable


Yes, given the first $(n-1)$ bits I can predict the n 'th bit

It depends

Weak PRGs

(do not use for crypto)

Lin.Cong. Generator with parameters a, b, p :


$$r[i] \leftarrow a \cdot r[i-1] + b \bmod p \quad \text{seed} = r[0]$$

output bits of $r[i]$

$i++$

glibc random():

$$r[i] \leftarrow (r[i-3] + r[i-31]) \% 2^{32}$$

output $r[i] \gg 1$

never use random()
for crypto!

(e.g. Kerberos V4)

Stream ciphers

Negligible vs.
non-negligible

Negligible and non-negligible

- In practice: ϵ is a scalar and
 - ϵ non-neg: $\epsilon \geq 1/2^{30}$ (likely to happen over 1GB of data)
 - ϵ negligible: $\epsilon \leq 1/2^{80}$ (won't happen over life of key)
- In theory: ϵ is a function $\epsilon: \mathbb{Z}^{\geq 0} \rightarrow \mathbb{R}^{\geq 0}$ and
 - ϵ non-neg: $\exists d: \epsilon(\lambda) \geq 1/\lambda^d$ inf. often ($\epsilon \geq 1/\text{poly}$, for many λ)
 - ϵ negligible: $\forall d, \lambda \geq \lambda_d: \epsilon(\lambda) \leq 1/\lambda^d$ ($\epsilon \leq 1/\text{poly}$, for large λ)

Few Examples

$\epsilon(\lambda) = 1/2^\lambda$: negligible

$\epsilon(\lambda) = 1/\lambda^{1000}$: non-negligible

PRGs: the rigorous theory view

PRGs are “parameterized” by a security parameter λ

- **PRG** becomes “more secure” as λ increases

Seed lengths and output lengths grow with λ

For every $\lambda=1,2,3,\dots$ there is a different PRG G_λ :

$$G_\lambda : K_\lambda \longrightarrow \{0,1\}^{n(\lambda)}$$

(in the lectures we will always ignore λ)

An example asymptotic definition

We say that $G_\lambda : K_\lambda \rightarrow \{0,1\}^{n(\lambda)}$ is predictable at position i if:

there exists a polynomial time (in λ) algorithm A s.t.

$$\Pr_{k \leftarrow K_\lambda} \left[A(\lambda, G_\lambda(k)|_{1,\dots,i}) = G_\lambda(k)|_{i+1} \right] > 1/2 + \epsilon(\lambda)$$

for some non-negligible function $\epsilon(\lambda)$

End of Segment

Stream ciphers

Attacks on OTP and
stream ciphers

Review

OTP: $E(k,m) = m \oplus k$, $D(k,c) = c \oplus k$

Making OTP practical using a PRG: $G: K \rightarrow \{0,1\}^n$

Stream cipher: $E(k,m) = m \oplus G(k)$, $D(k,c) = c \oplus G(k)$

Security: PRG must be unpredictable (better def in two segments)

Attack 1: **two time pad** is insecure !!

Never use stream cipher key more than once !!

$$C_1 \leftarrow m_1 \oplus \text{PRG}(k)$$

$$C_2 \leftarrow m_2 \oplus \text{PRG}(k)$$

Eavesdropper does:

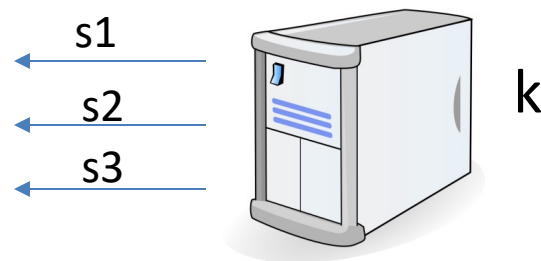
$$C_1 \oplus C_2 \rightarrow m_1 \oplus m_2$$

Enough redundancy in English and ASCII encoding that:

$$m_1 \oplus m_2 \rightarrow m_1, m_2$$

Real world examples

- Project Venona
- MS-PPTP (windows NT):
 - $K=(K_{C \rightarrow S}, K_{S \rightarrow C})$



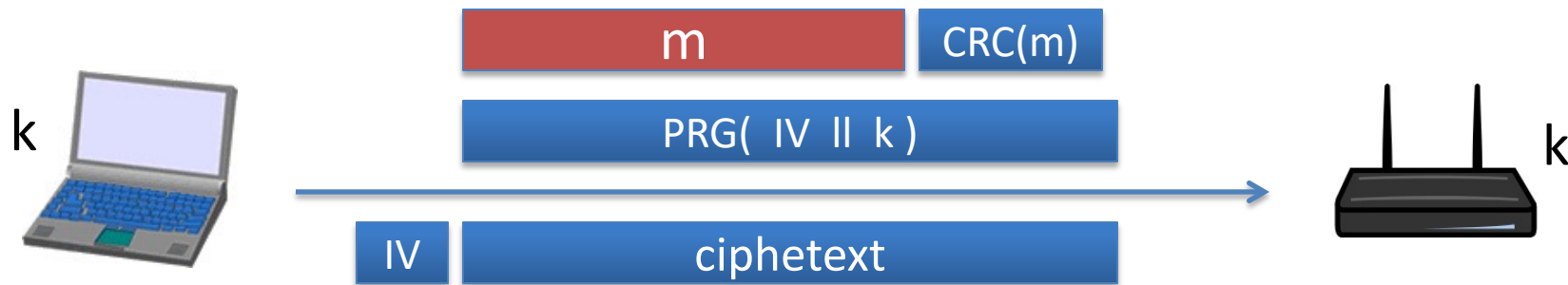
- $[m1 \parallel m2 \parallel m3] \oplus G(k)$

$$[s1 \parallel s2 \parallel s3] \oplus G(k)$$

Need different keys for $C \rightarrow S$ and $S \rightarrow C$

Real world examples

802.11b WEP:

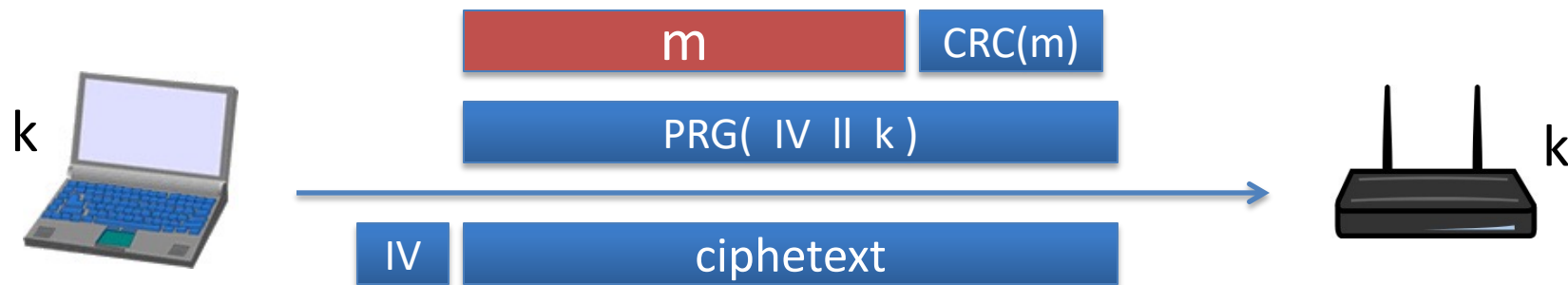


Length of IV: 24 bits

- Repeated IV after $2^{24} \approx 16\text{M}$ frames
- On some 802.11 cards: IV resets to 0 after power cycle

Avoid related keys

802.11b WEP:



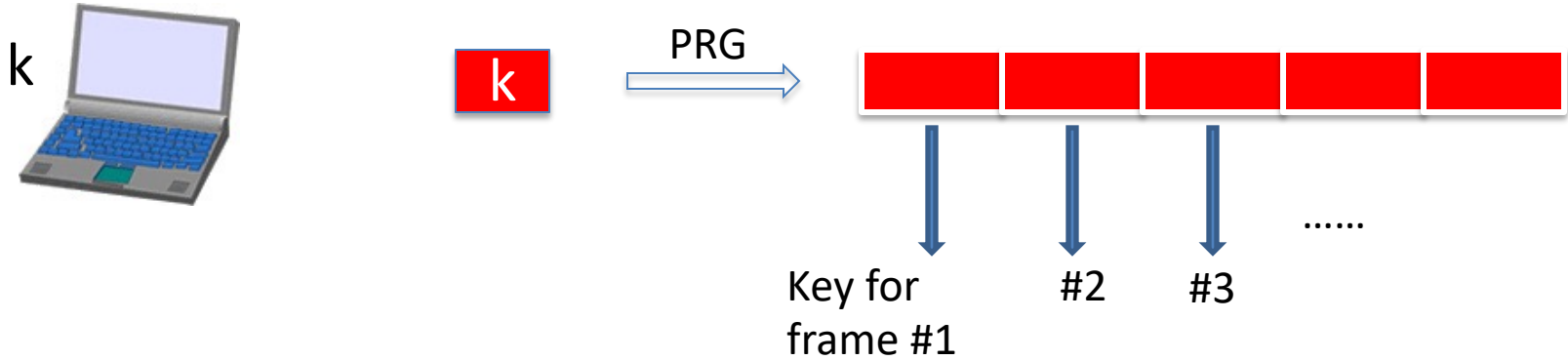
key for frame #1: $(1 \parallel k)$

key for frame #2: $(2 \parallel k)$

\vdots

For the RC4 PRG:FMS2001 \Rightarrow
can recover k after 10^6 frames
recent attacks ≈ 40000 frames

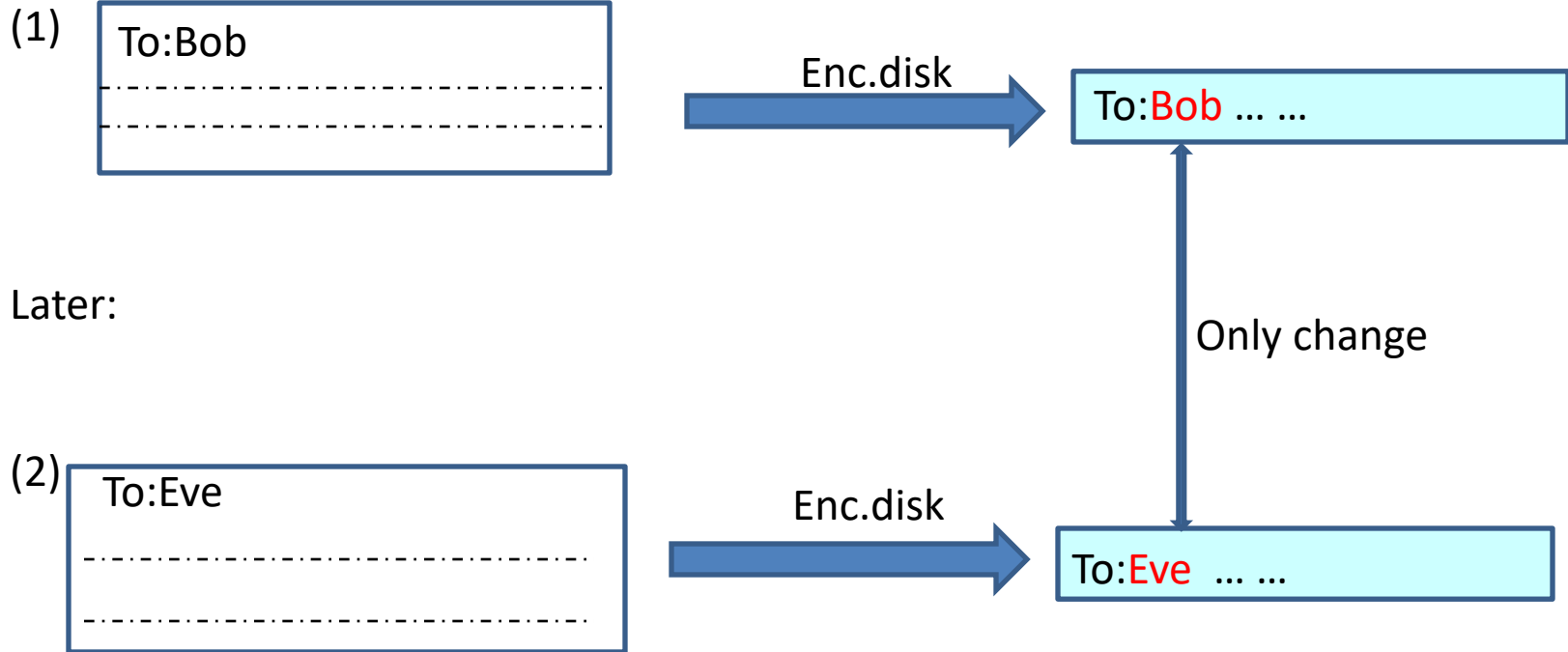
A better construction



⇒ now each frame has a pseudorandom key

better solution: use stronger encryption method (as in WPA2)

Yet another example: disk encryption

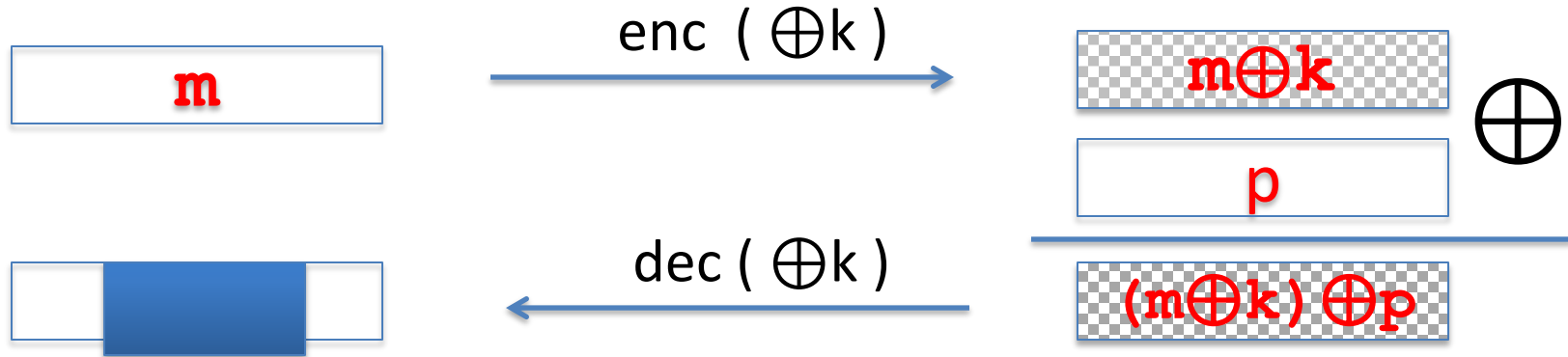


Two time pad: summary

Never use stream cipher key more than once !!

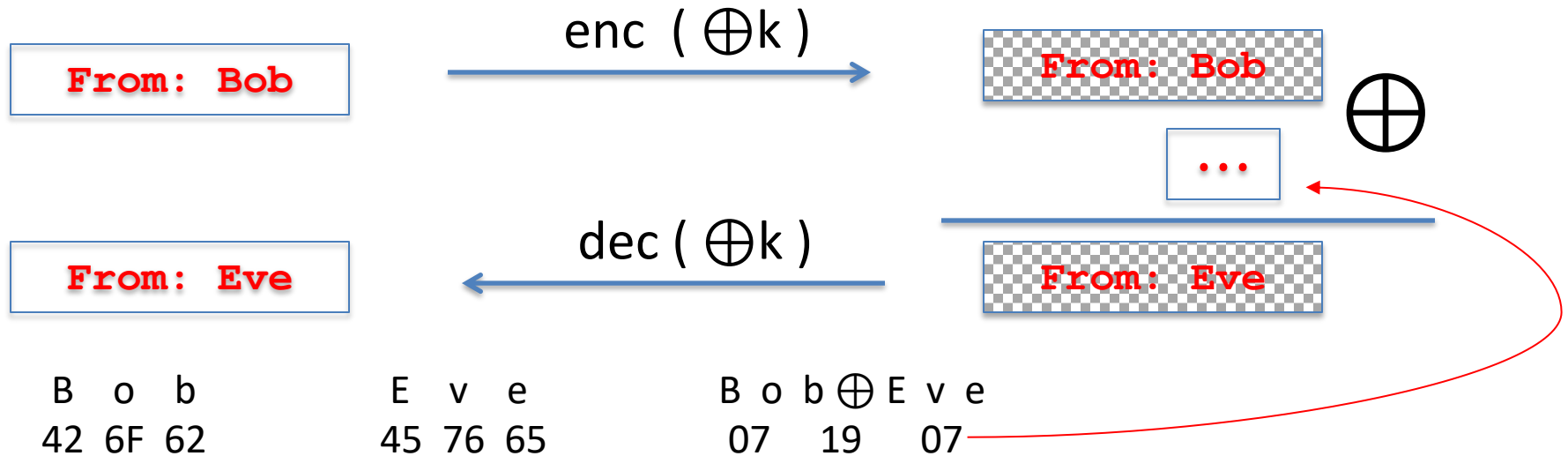
- Network traffic: negotiate new key for every session (e.g. TLS)
- Disk encryption: typically do not use a stream cipher

Attack 2: no integrity (OTP is malleable)



Modifications to ciphertext are undetected and have **predictable** impact on plaintext

Attack 2: no integrity (OTP is malleable)



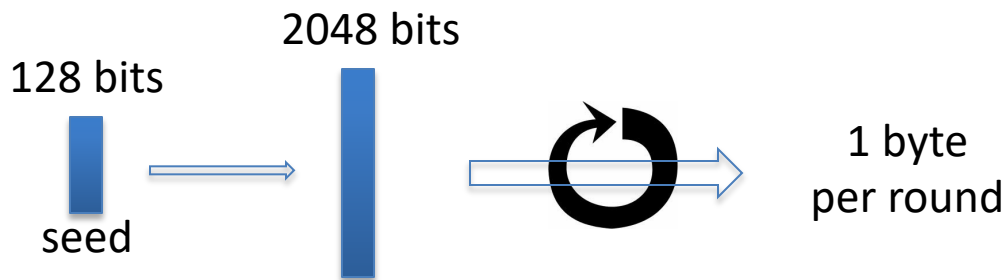
Modifications to ciphertext are undetected and have predictable impact on plaintext

End of Segment

Stream ciphers

Real-world Stream Ciphers

Old example (software): RC4 (1987)



- Used in HTTPS and WEP
- Weaknesses:
 1. Bias in initial output: $\Pr[2^{\text{nd}} \text{ byte} = 0] = 2/256$
 2. Prob. of (0,0) is $1/256^2 + 1/256^3$
 3. Related key attacks

Modern stream ciphers: eStream

$$\text{PRG: } \underbrace{\{0,1\}^s}_{\text{Seed}} \times \underbrace{R}_{\text{nonce}} \longrightarrow \{0,1\}^n$$

Nonce: a non-repeating value for a given key.

$$E(k, m ; r) = m \oplus \text{PRG}(k ; r)$$

The pair (k,r) is never used more than once.

Chacha20 (SW+HW)

Chacha20: $\{0,1\}^{256} \times \{0,1\}^{64} \rightarrow \{0,1\}^n$
 nonce

Padding function $\text{pad}(s, j, n)$:

- 256-bit seed s_0, s_1, \dots, s_7 in $\{0,1\}^{32}$
- 64-bit counter j_0, j_1 in $\{0,1\}^{32}$
- 64-bit nonce n_0, n_1 in $\{0,1\}^{32}$
- Output a 512-bit block x_0, \dots, x_{15} in $\{0,1\}^{32}$

$$\begin{pmatrix} x_0 & x_1 & x_2 & x_3 \\ x_4 & x_5 & x_6 & x_7 \\ x_8 & x_9 & x_{10} & x_{11} \\ x_{12} & x_{13} & x_{14} & x_{15} \end{pmatrix} \leftarrow \begin{pmatrix} c_0 & c_1 & c_2 & c_3 \\ s_0 & s_1 & s_2 & s_3 \\ s_4 & s_5 & s_6 & s_7 \\ j_0 & j_1 & n_0 & n_1 \end{pmatrix}$$

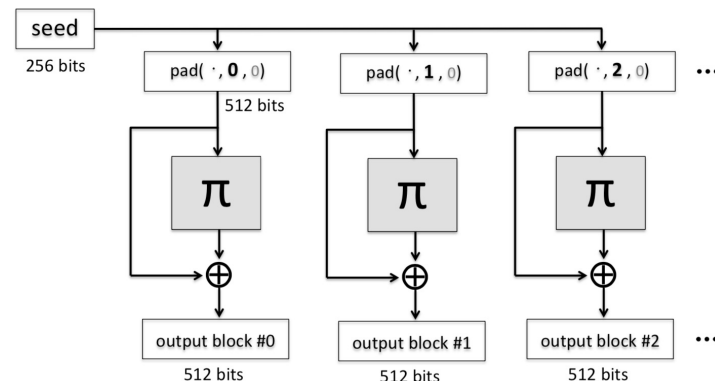
Permutation function $\pi: \{0,1\}^{512} \rightarrow \{0,1\}^{512}$

- (1) QuarterRound(x_0, x_4, x_8, x_{12}), (2) QuarterRound(x_1, x_5, x_9, x_{13}),
- (3) QuarterRound(x_2, x_6, x_{10}, x_{14}), (4) QuarterRound(x_3, x_7, x_{11}, x_{15}),
- (5) QuarterRound(x_0, x_5, x_{10}, x_{15}), (6) QuarterRound(x_1, x_6, x_{11}, x_{12}),
- (7) QuarterRound(x_2, x_7, x_8, x_{13}), (8) QuarterRound(x_3, x_4, x_9, x_{14}).

QuarterRound(a, b, c, d):

```

a += b; d ^= a; d <<= 16;
c += d; b ^= c; b <<= 12;
a += b; d ^= a; d <<= 8;
c += d; b ^= c; b <<= 7;
```



Is Chacha20 secure (unpredictable) ?

- Unknown: no known **provably** secure PRGs
- In reality: no known attacks better than exhaustive search

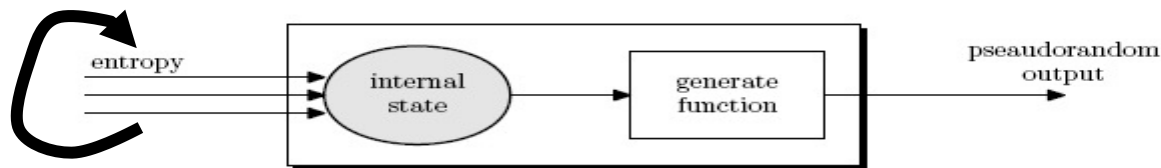
Performance:

Crypto++ 5.6.0 [Wei Dai]

AMD Opteron, 2.2 GHz (Linux)

	<u>PRG</u>	<u>Speed (MB/sec)</u>
	RC4	126
eStream	Salsa20/12	643
	Sosemanuk	727

Generating Randomness (e.g. keys, IV)



Pseudo random generators in practice: (e.g. /dev/random)

- Continuously add entropy to internal state
- Entropy sources:
 - Hardware RNG: Intel **RdRand** inst. (Ivy Bridge). 3Gb/sec.
 - Timing: hardware interrupts (keyboard, mouse)

NIST SP 800-90: NIST approved generators

End of Segment

Stream ciphers

PRG Security Defs

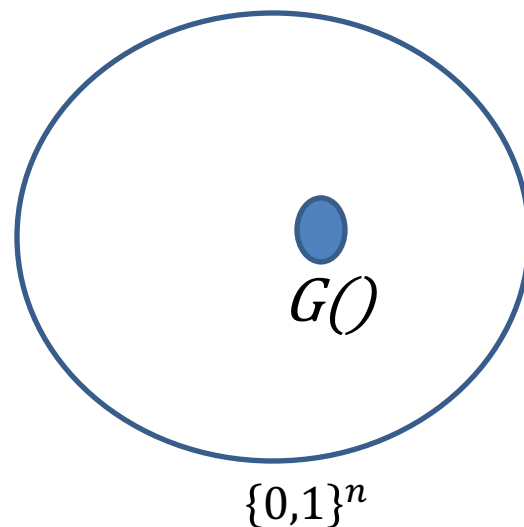
Let $G:K \rightarrow \{0,1\}^n$ be a PRG

Goal: define what it means that

$$[k \stackrel{R}{\leftarrow} K, \text{output } G(k)]$$

is “indistinguishable” from

$$[r \stackrel{R}{\leftarrow} \{0,1\}^n, \text{output } r]$$



Statistical Tests

Statistical test on $\{0,1\}^n$:

an alg. A s.t. $A(x)$ outputs “0”(not random) or “1”(random)

Examples:

$$(1) \quad A(x)=1 \text{ iff } |\#0(x)-\#1(x)| \leq 10 \cdot \sqrt{n}$$

$$(2) \quad A(x)=1 \text{ iff } |\#00(x)-n/4| \leq 10 \cdot \sqrt{n}$$

Statistical Tests

More examples:

(3) $A(x)=1$ iff $\text{max-run-of-0}(x) < 10 \cdot \log_2(n)$

...

...

Advantage

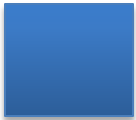
Let $G:K \rightarrow \{0,1\}^n$ be a PRG and A a stat. test on $\{0,1\}^n$

Define:

$$\text{Adv}_{PRG}[A, G] = \left| \Pr_{k \leftarrow K} [A(G(k)) = 1] - \Pr_{r \leftarrow \{0,1\}^n} [A(r) = 1] \right| \in [0,1]$$

Adv close to 1 \Rightarrow A can dist. G from random

Adv close to 0 \Rightarrow A cannot dist. G from random

A silly example: $A(x) = 0 \Rightarrow \text{Adv}_{PRG}[A, G] =$ 

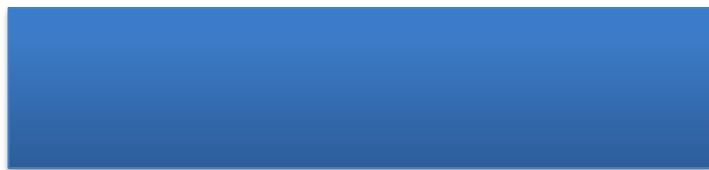
Suppose $G:K \rightarrow \{0,1\}^n$ satisfies $\text{msb}(G(k)) = 1$ for 2/3 of keys in K

Define stat. test $A(x)$ as:

if $[\text{msb}(x)=1]$ output "1" else output "0"

Then

$$\text{Adv}_{\text{PRG}}[A,G] = \left| \Pr[A(G(k))=1] - \Pr[A(r)=1] \right| =$$



Secure PRGs: crypto definition

Def: We say that $G:K \rightarrow \{0,1\}^n$ is a secure PRG if

\forall "eff" stat. test A :

$\text{Adv}_{\text{PRG}}[A,G]$ is "negligible"

Are there provably secure PRGs?

but we have heuristic candidates.

More Generally

Let P_1 and P_2 be two distributions over $\{0,1\}^n$

Def: We say that P_1 and P_2 are

computationally indistinguishable (denoted $P_1 \approx_\rho P_2$)

if \forall "eff" stat. test A :

$$\left| \Pr_{x \leftarrow P_1}[(A(x)=1)] - \Pr_{x \leftarrow P_2}[(A(x)=1)] \right| < \text{"negligible"}$$

Example: a PRG is secure if $\{k \xleftarrow{R} K : G(k)\} \approx_p \text{uniform}(\{0,1\}^n)$

End of Segment

Stream ciphers

Semantic security

Goal: secure PRG \Rightarrow “secure” stream cipher

What is a secure cipher?

Attacker's abilities: **obtains one ciphertext** (for now)

Possible security requirements:

attempt #1: **attacker cannot recover secret key** $E(k,m)=m$

attempt #2: **attacker cannot recover all of plaintext**

$$E(k, m_0 || m_1) = m_0 || m_1 \oplus k$$

Recall Shannon's idea:

CT should reveal no "info" about PT

Recall Shannon's perfect secrecy

Let (E,D) be a cipher over (K,M,C)

(E,D) has perfect secrecy if $\forall m_0, m_1 \in M \quad (|m_0| = |m_1|)$

$$\{ E(k, m_0) \} = \{ E(k, m_1) \} \quad \text{where } k \leftarrow K$$

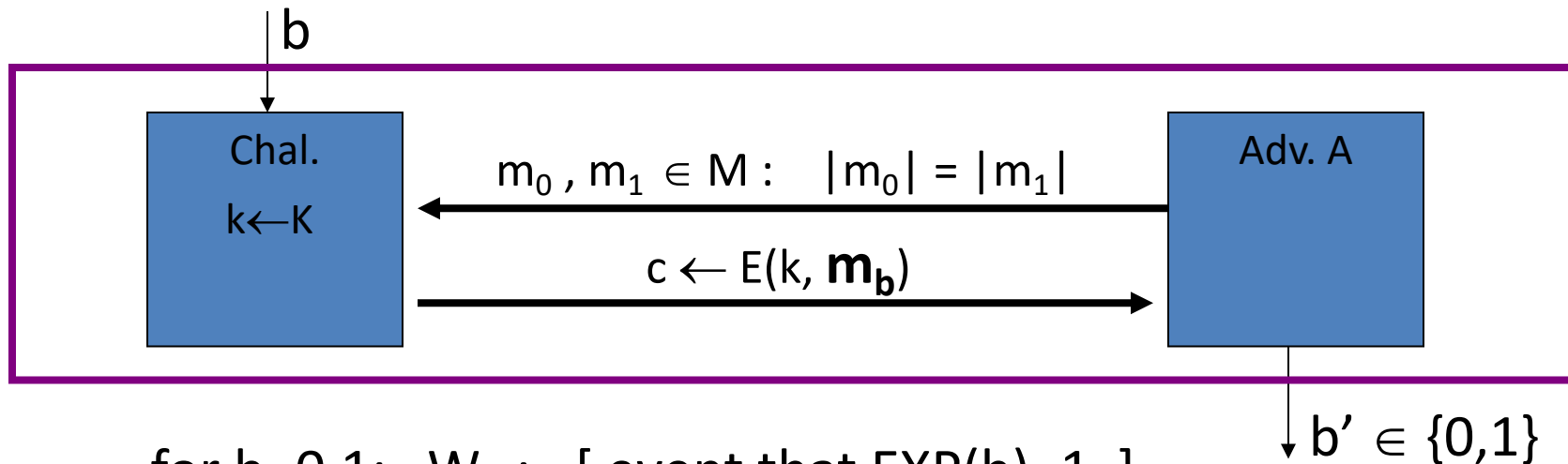
(E,D) has perfect secrecy if $\forall m_0, m_1 \in M \quad (|m_0| = |m_1|)$

$$\{ E(k, m_0) \} \approx_p \{ E(k, m_1) \} \quad \text{where } k \leftarrow K$$

... but also need adversary to exhibit $m_0, m_1 \in M$ explicitly

Semantic Security (one-time key)

For $b=0,1$ define experiments $\text{EXP}(0)$ and $\text{EXP}(1)$ as:



for $b=0,1$: $W_b := [\text{event that } \text{EXP}(b)=1]$

$$\text{Adv}_{\text{SS}}[A, E] := \left| \Pr[W_0] - \Pr[W_1] \right| \in [0,1]$$

Semantic Security (one-time key)

Def: \mathbb{E} is **semantically secure** if for all efficient A

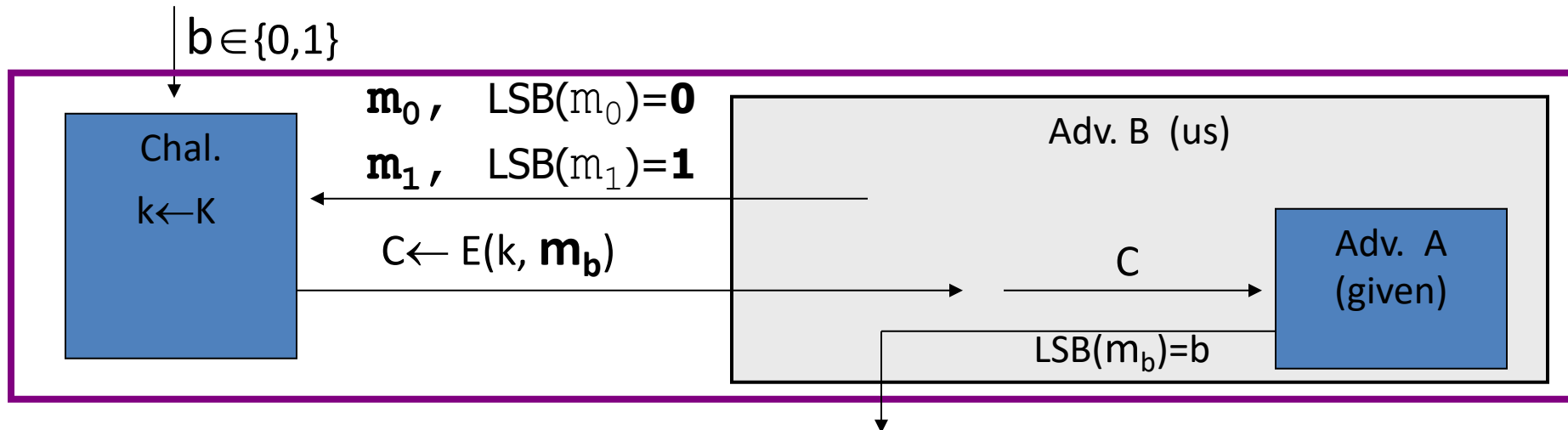
$\text{Adv}_{\text{ss}}[A, \mathbb{E}]$ is negligible.

\Rightarrow for all explicit $m_0, m_1 \in M$: $\{ E(k, m_0) \} \approx_p \{ E(k, m_1) \}$

Examples

Suppose efficient A can always deduce LSB of PT from CT.

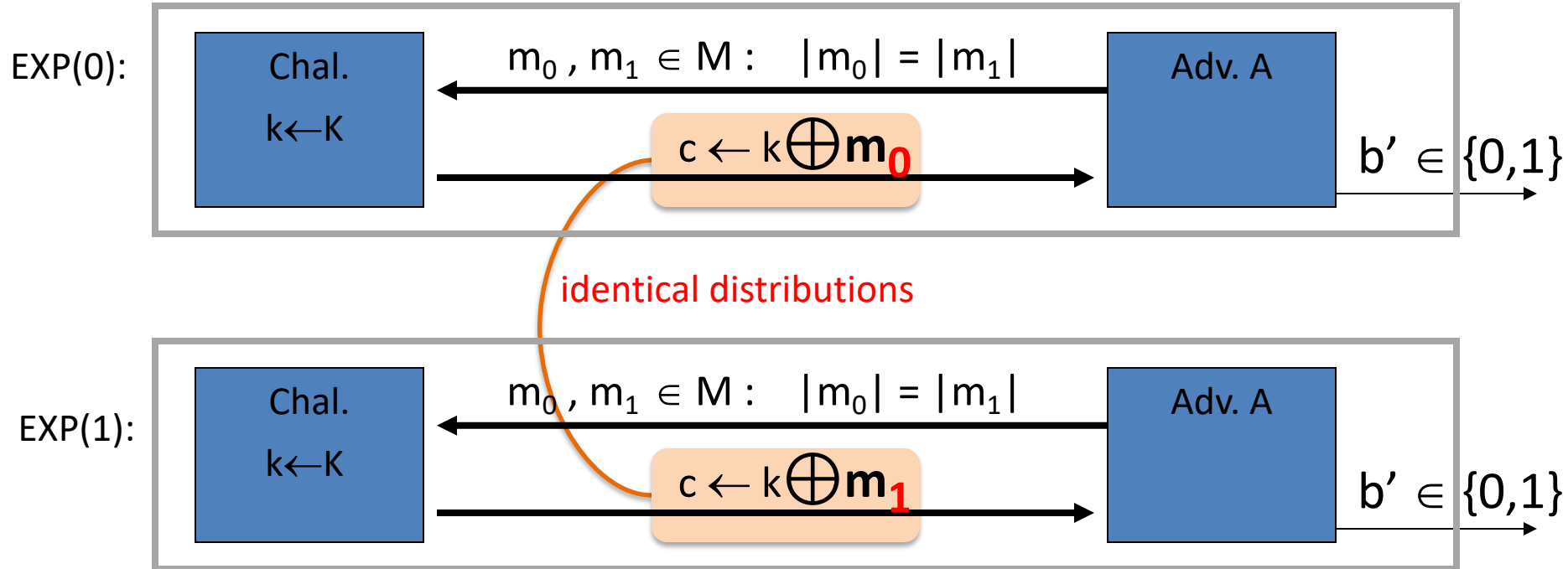
$\Rightarrow \mathbb{E} = (E, D)$ is not semantically secure.



Then $\text{Adv}_{ss}[B, \mathbb{E}] = \left| \Pr[\mathbf{EXP}(0)=1] - \Pr[\mathbf{EXP}(1)=1] \right| =$



OTP is semantically secure



For all A: $\text{Adv}_{\text{SS}}[A, \text{OTP}] = \left| \Pr[A(k \oplus m_0) = 1] - \Pr[A(k \oplus m_1) = 1] \right|$

End of Segment

Stream ciphers

Stream ciphers are
semantically secure

Goal: secure PRG \Rightarrow semantically secure stream cipher

Stream ciphers are semantically secure

(Theorem 3.1 from GCAC, refer to pp.49)

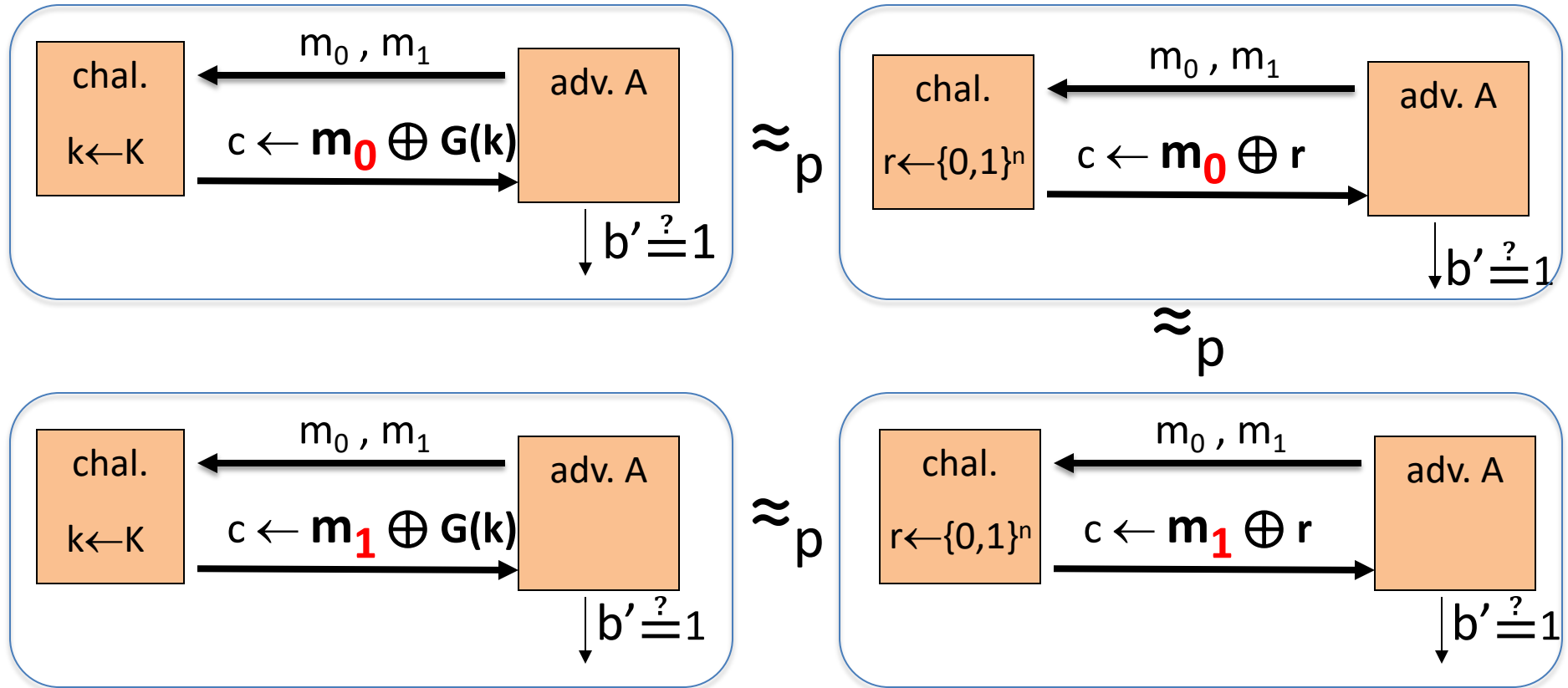
Thm: $G:K \rightarrow \{0,1\}^n$ is a secure PRG \Rightarrow

stream cipher E derived from G is sem. sec.

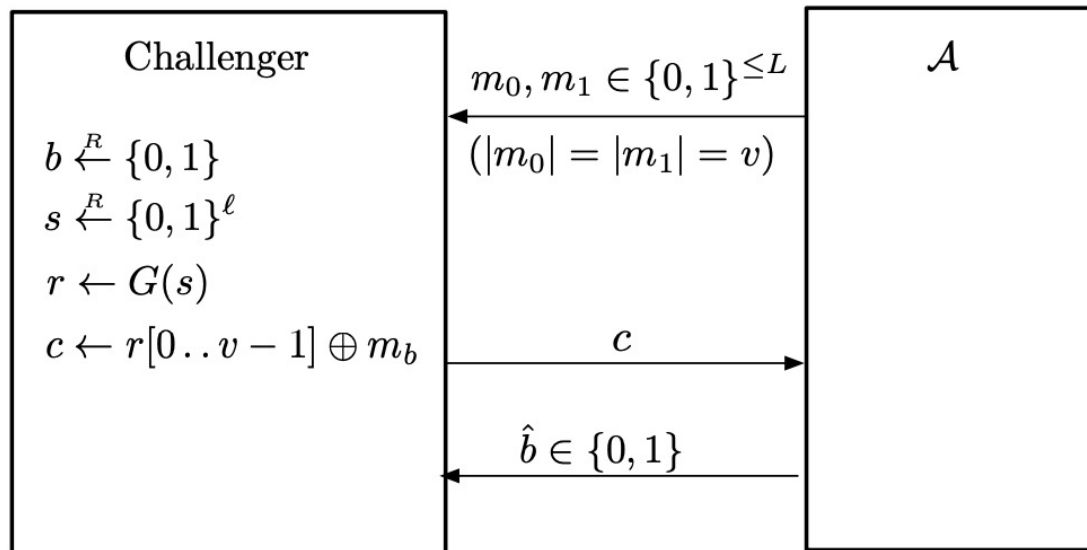
\forall sem. sec. adversary A , \exists a PRG adversary B s.t.

$$\text{Adv}_{\text{SS}}[A,E] \leq 2 \cdot \text{Adv}_{\text{PRG}}[B,G]$$

Proof: intuition



Game 0



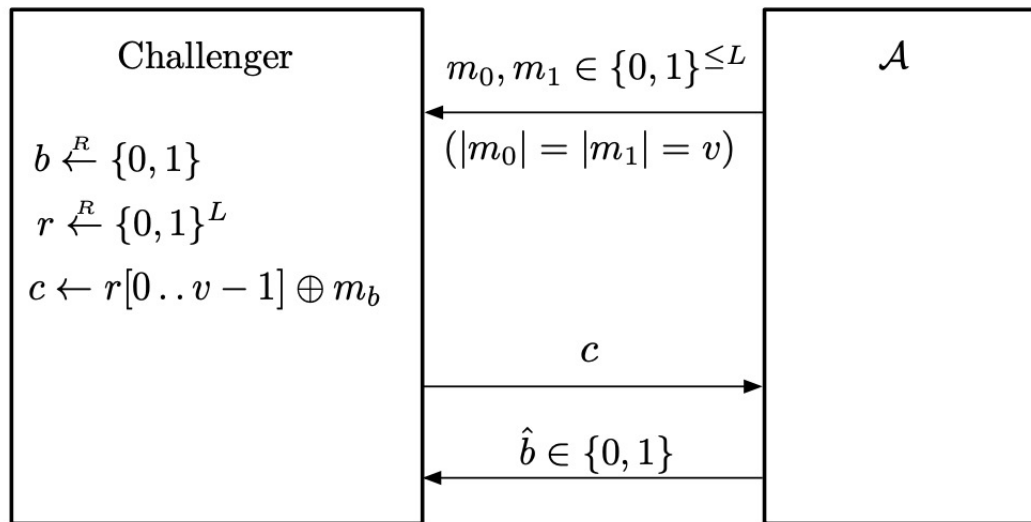
W_0 : the event that $\hat{b} = b$
in Game 0

$$\text{SSadv}^*[\mathcal{A}, \mathcal{E}] = |\Pr[W_0] - 1/2|$$

Upon receiving $m_0, m_1 \in \{0, 1\}^v$ from \mathcal{A} , for some $v \leq L$, do:

$b \xleftarrow{R} \{0, 1\}$
 $s \xleftarrow{R} \{0, 1\}^\ell, r \leftarrow G(s)$
 $c \leftarrow r[0..v-1] \oplus m_b$
send c to \mathcal{A} .

Game 1



W_1 : the event that $\hat{b} = b$
in Game 1

$$\Pr[W_1] = 1/2.$$

Upon receiving $m_0, m_1 \in \{0, 1\}^v$ from \mathcal{A} , for some $v \leq L$, do:

$$b \xleftarrow{R} \{0, 1\}$$

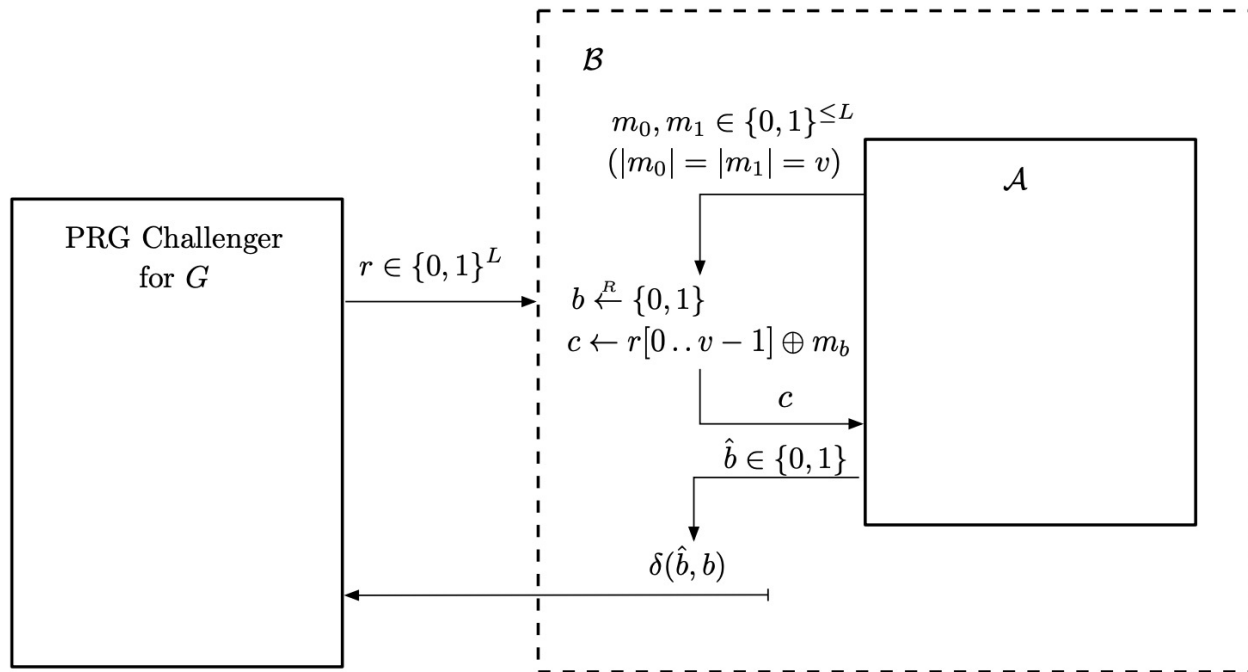
$$r \xleftarrow{R} \{0, 1\}^L$$

$$c \leftarrow r[0..v-1] \oplus m_b$$

send c to \mathcal{A} .

Our goal: $|\Pr[W_0] - \Pr[W_1]| = \text{PRGAdv}[\mathcal{B}, G]$.

Define $\delta(x, y) := \begin{cases} 1 & \text{if } x = y, \\ 0 & \text{if } x \neq y. \end{cases}$



P0: probability that \mathcal{B} output 1 when PRG challenger is running exp 0.

P1: probability that \mathcal{B} output 1 when PRG challenger is running exp 1.

$$\text{PRGAdv}[\mathcal{B}, G] = |p_1 - p_0|.$$

$$p_0 = \Pr[W_0], \quad p_1 = \Pr[W_1].$$



$$|\Pr[W_0] - \Pr[W_1]| = \text{PRGAdv}[\mathcal{B}, G].$$

Upon receiving $m_0, m_1 \in \{0, 1\}^v$ from \mathcal{A} , for some $v \leq L$, do:

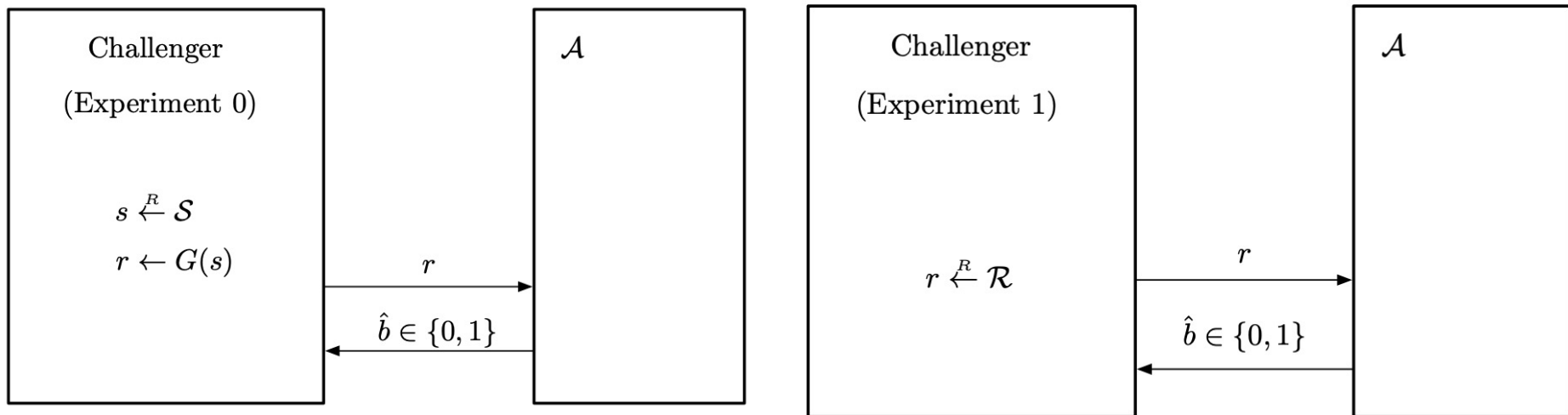
$b \xleftarrow{R} \{0, 1\}$

$c \leftarrow r[0..v-1] \oplus m_b$

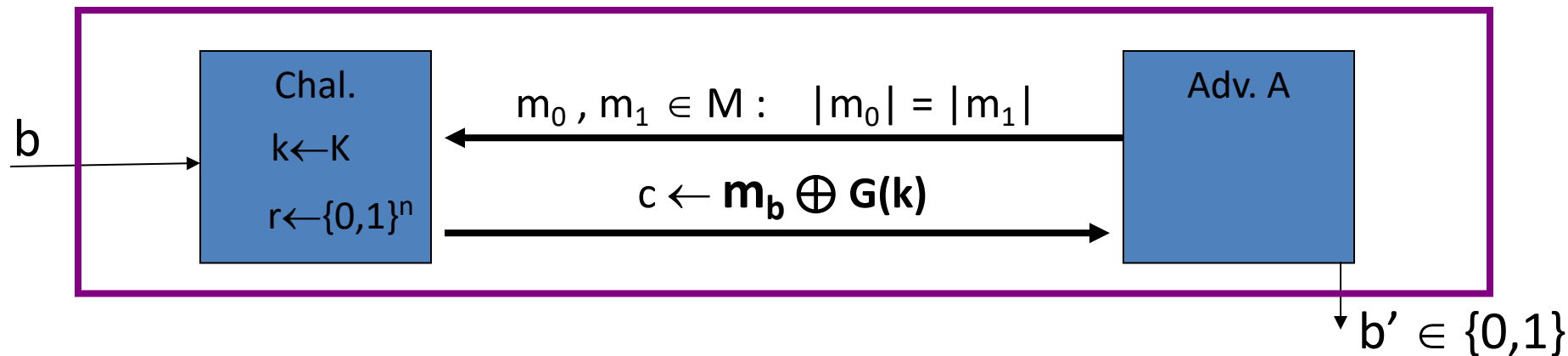
send c to \mathcal{A} .

Finally, when \mathcal{A} outputs a bit \hat{b} , \mathcal{B} outputs the bit $\delta(\hat{b}, b)$.

Recall PRG game



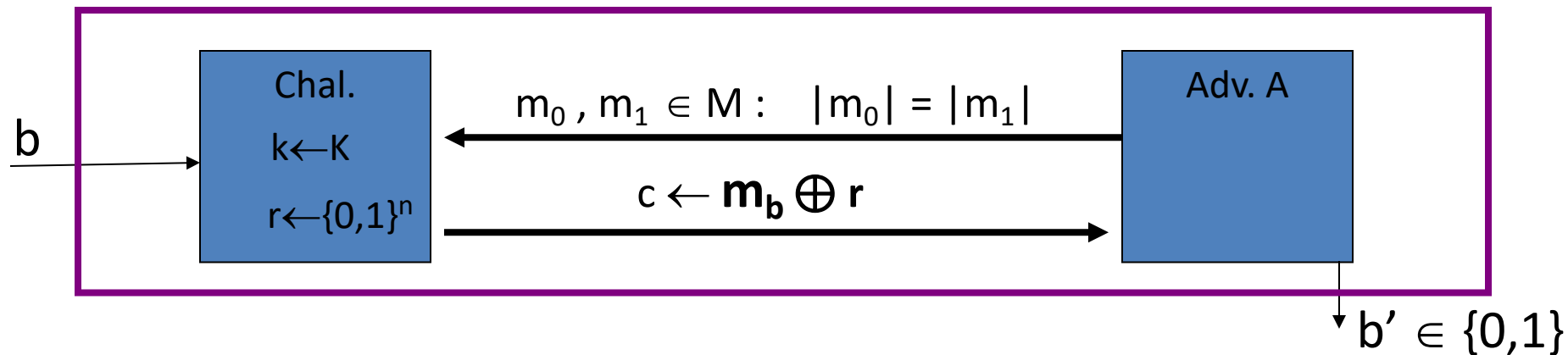
Proof: Let A be a sem. sec. adversary.



For $b=0,1$: $W_b :=$ [event that $b'=1$].

$$\text{Adv}_{SS}[A,E] = \left| \Pr[W_0] - \Pr[W_1] \right|$$

Proof: Let A be a sem. sec. adversary.



For $b=0,1$: $W_b :=$ [event that $b'=1$].

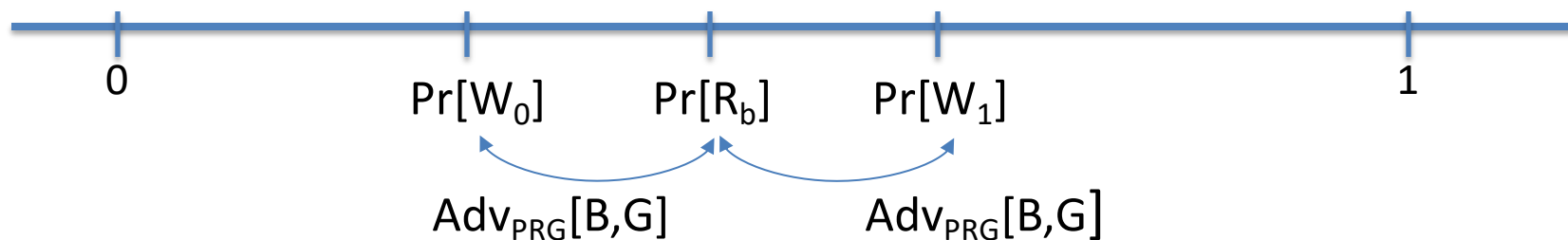
$$\text{Adv}_{SS}[A,E] = \left| \Pr[W_0] - \Pr[W_1] \right|$$

For $b=0,1$: $R_b :=$ [event that $b'=1$]

Proof: Let A be a sem. sec. adversary.

Claim 1: $\left| \Pr[R_0] - \Pr[R_1] \right| = \text{Adv}_{\text{SS}}[A, \text{OTP}] = 0$

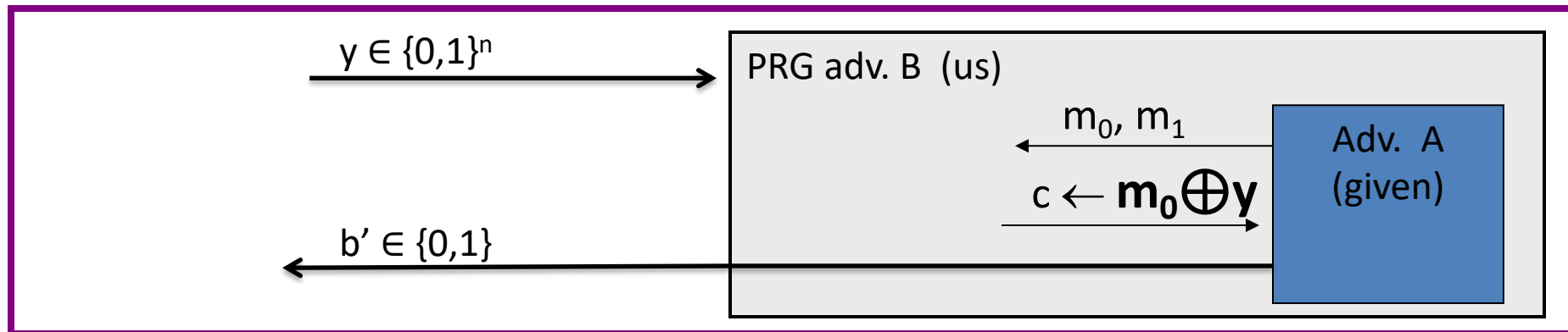
Claim 2: $\exists B: \left| \Pr[W_b] - \Pr[R_b] \right| = \text{Adv}_{\text{PRG}}[B, G] \quad \text{for } b=0,1$



$$\Rightarrow \text{Adv}_{\text{SS}}[A, E] = \left| \Pr[W_0] - \Pr[W_1] \right| \leq 2 \cdot \text{Adv}_{\text{PRG}}[B, G]$$

Proof of claim 2: $\exists B: \left| \Pr[W_0] - \Pr[R_0] \right| = \text{Adv}_{\text{PRG}}[B, G]$

Algorithm B:



$$\text{Adv}_{\text{PRG}}[B, G] = \left| \Pr_{k \leftarrow K}^R [B(G(k)) = 1] - \Pr_{r \leftarrow \{0,1\}^n}^R [B(r) = 1] \right| = |\Pr[W_0] - \Pr[R_0]|$$

End of Segment