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# Entropic Security and the Encryption of High-Entropy Messages

Yevgeniy Dodis, NYU

Adam Smith, Weizmann (work done at MIT)

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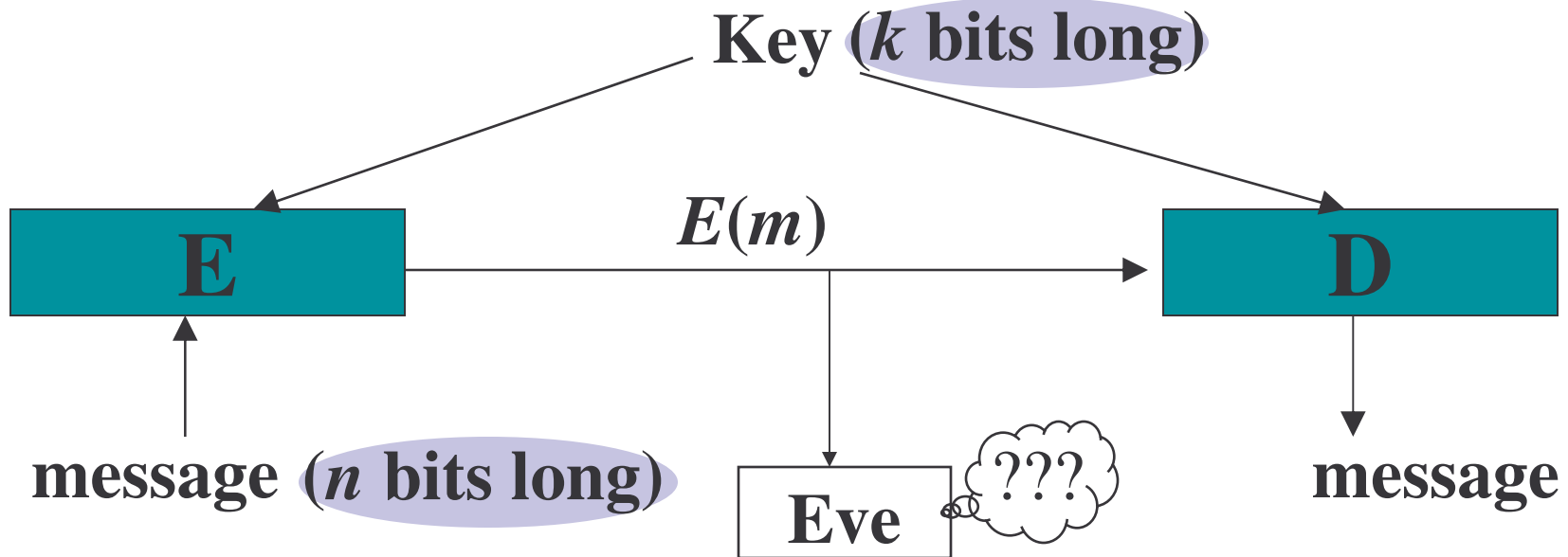
# Unconditional Secrecy When Leaking Information is Unavoidable

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# Symmetric Encryption

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- Shannon: Symmetric Encryption without computational assumptions requires  $k \geq n$  (achieved by one-time pad)
- Russell and Wang 2002 [RW02]: **What can be said when the message is guaranteed to have high entropy?**

# “Entropic” Security [CMR98,RW02]

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[RW02]: Encryption of high-entropy messages

1. No computational assumptions (statistical secrecy)
2. Assume message distribution has **high entropy**
3. Constructions with short key (not possible without #2)

[CMR98]: Hash functions which hide “partial information”

1. Given  $H(m)$  and  $m'$ , one can check if  $m' = m$
2. Assume **high entropy**
3.  $H(m)$  leaks no predicate of  $m$

# This Paper

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## Motivation:

- Systematic study, simplification of entropic security
- Understand “high-entropy secrets” in simple setting
- Develop tools for settings other than encryption

- This talk:**
- Definitions
  - Equivalent characterizations (extraction)
  - Encryption: analysis, constructions, bounds
  - Ideas for Other Settings

# Entropic Security — Intuition

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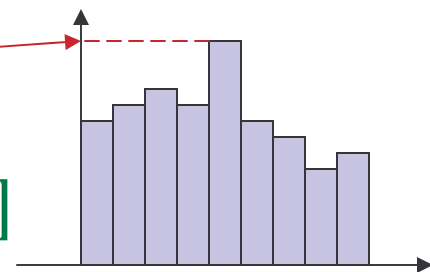
If Eve is uncertain about  $M$ , then  $E(M)$  does not reveal any predicate of  $M$ .

# Min-Entropy of Random Variables

- There are various ways to measure entropy...

- $X$  a random variable on  $\{0,1\}^n$

- Probability of predicting  $X = \max_x \Pr[X = x]$



- **Min-entropy:**  $H_\infty(X) = -\log(\max_x \Pr[X=x])$

- “Message has min-entropy  $t$ ” means that adversary’s probability of guessing the message is  $2^{-t}$

# Entropic Security [RW02]

Definition:  $(E,D)$  is  $(\lambda,\epsilon)$ -entropically secure if

$\forall$  distributions  $M$  on  $\{0,1\}^n$  with  $H_\infty(M) \geq n-\lambda$

$\forall$  predicates  $g:\{0,1\}^n \rightarrow \{0,1\}$

$\forall$  (adversaries)  $A:\{0,1\}^* \rightarrow \{0,1\}$

$\exists$  random variable  $A'$  (independent of  $M$ )

$$\left| \Pr[A(E(M)) = g(M)] - \Pr[A' = g(M)] \right| \leq \epsilon$$

- Statistical version of **semantic security** à la [GM] but only for **high-entropy distributions**



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$$\left| \Pr[A(E(M)) = g(M)] - \Pr[A' = g(M)] \right| \leq \epsilon$$

## Caveats:

- Assumes that message has **high entropy!**  
What if the adversary knows more than you think he knows?
- **Composition / computational “issues”**: what happens when such a scheme gets plugged into more complex situations?

# Entropic Security [RW02]

Definition:  $(E,D)$  is  $(\lambda,\epsilon)$ -entropically secure if

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$$\left| \Pr[A(E(M)) = g(M)] - \Pr[A' = g(M)] \right| \leq \epsilon$$

[RW02] There exist  $(\lambda,\epsilon)$ -ES schemes with

$$k \approx \lambda + 3 \log(1/\epsilon)$$

(Without high entropy, still need  $k \approx n$ )

Two constructions: twists on the one-time pad. Complicated analysis.

# Results (and Outline)

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## ➤ Equivalent Definitions:

- Hiding all functions
- Indistinguishability
- **Intuition**: entropic security  $\approx$  randomness extraction
- Two Simple, General Constructions (improve [RW02])
  - Step on expander graph
  - Hashing
- Lower Bounds

# Is This the Right Definition?

Def:  $(\lambda, \epsilon)$ -entropically secure if  $\forall M$  (entropy  $\geq n - \lambda$ ),

$\forall$  predicates  $g: \{0,1\}^n \rightarrow \{0,1\}$

$\forall$  adversaries  $A, \exists A'$ ,

$$| \Pr[A(E(M)) = g(M)] - \Pr[A' = g(M)] | \leq \epsilon$$

Before we commit long-term:

- Can we do better? (This one is better than it looks)
- Can we work with this? (Yes, with effort)

# Is This the Right Definition?

Def:  $(\lambda, \epsilon)$ -entropically secure if  $\forall M$  (entropy  $\geq n - \lambda$ ),  
 $\forall$  functions  $g: \{0,1\}^n \rightarrow$  any domain you like  
 $\forall$  adversaries  $A, \exists A'$ ,  
$$| \Pr[A(E(M)) = g(M)] - \Pr[A' = g(M)] | \leq \epsilon$$

Q: Why only predicates? What about functions? Relations?  
(If cryptography is everything, why sell ourselves short?)

A: Functions are equivalent!  
(Relations impossible with short key)

# Equivalence of Functions and Predicates

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For function  $f$ , random variable  $\mathbf{M}$  :

$$\mathbf{pred}_f(\mathbf{M}) = \text{most likely value} = \max_z \{ \Pr[f(\mathbf{M}) = z] \}$$

**Lemma:** If

- $\mathbf{M}$  random variable (entropy  $\geq 2\log(1/\epsilon)$  )
- $E()$  ,  $A()$  randomized maps,  $f$  **arbitrary function**.
- $\Pr[ A(E(\mathbf{M})) = f(\mathbf{M}) ] \geq \mathbf{pred}_f(\mathbf{M}) + \epsilon$

**Then** there exist **predicates**  $B$  and  $g$  such that

$$\Pr[ B(A(E(\mathbf{M}))) = g(\mathbf{M}) ] \geq \mathbf{pred}_g(\mathbf{M}) + \epsilon / 4$$

# Indistinguishability for High Entropy

Def:  $(\lambda, \epsilon)$ -entropically secure if  $\forall M$  (entropy  $\geq n - \lambda$ ),  
 $\forall$  functions  $g: \{0,1\}^n \rightarrow$  any domain you like  
 $\forall$  adversaries  $A, \exists A'$ ,  
$$| \Pr[A(E(M)) = g(M)] - \Pr[A' = g(M)] | \leq \epsilon$$

Recall: (Ordinary) semantic security  $\Rightarrow$

$\forall$  distributions  $M, M': E(M) \approx_{PPT} E(M')$

# Indistinguishability for High Entropy

Def:  $(\lambda, \epsilon)$ -entropically secure if  $\forall M$  (entropy  $\geq n - \lambda$ ),  
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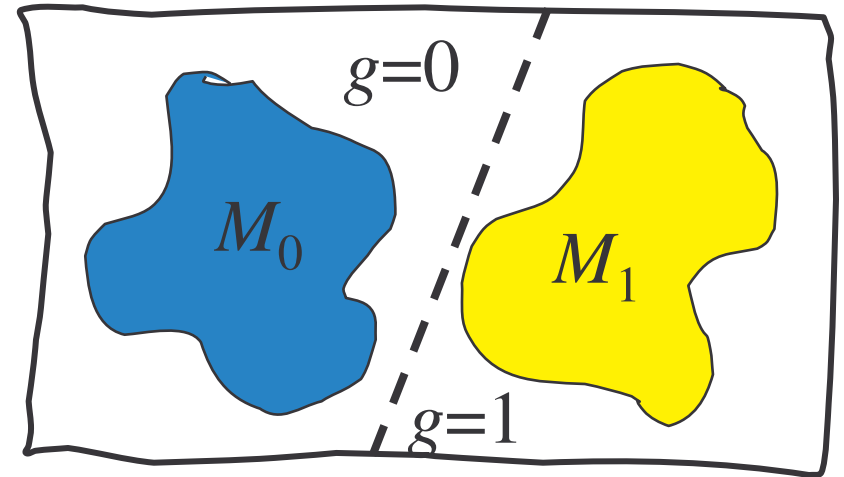
Definition:  $(E, D)$  is  $(t, \epsilon)$ -indistinguishable (IND) if  
 $\forall$  distributions  $M, M'$  with  $H_\infty(M), H_\infty(M') \geq t$ :  
$$SD(E(M), E(M')) \leq \epsilon$$

**Proposition:**  $(\lambda, \epsilon)$ -ES equiv. to  $(t, \epsilon')$ -IND for  $t = n - \lambda - 1$



# Proof: $(\lambda, \varepsilon)$ -ES $\Rightarrow (n-\lambda-1, 4\varepsilon)$ -IND

- Take any  $M_0, M_1$  of min-entropy  $\geq t = n-\lambda-1$   
(Sufficient to prove lemma for flat distrib's on  $2^t$  points)
- Suppose  $M_0 \cap M_1 = \emptyset$   
Use  $g(x) = b$  if  $x \in \text{supp}(M_b)$   
and  $M^* = M_b$  for  $b \leftarrow \{0,1\}$
- $H_\infty(M^*) = t+1 = n-\lambda$   
 $\Rightarrow$  No  $A$  predicts  $g$  better than  $1/2+\varepsilon$   
 $\Rightarrow SD(E(M_0), E(M_1)) \leq 2\varepsilon$
- If  $M_0, M_1$  not disjoint, find  $M_2$  disjoint to both.



# Proof: $(n-\lambda-1)$ -IND $\Rightarrow$ $\lambda$ -ES

- Suppose that  $\exists A, f, M$  such that
 
$$\Pr[A(E(M)) = f(M)] \geq \text{pred}_f(M) + \varepsilon$$

- Define  $M_y = M \upharpoonright_{\{f(M)=y\}}$

- Group  $M_y$ 's into bins so that

$$\varepsilon / 2 \leq \text{weight of } M_y \leq \text{pred}_f + \varepsilon/2$$

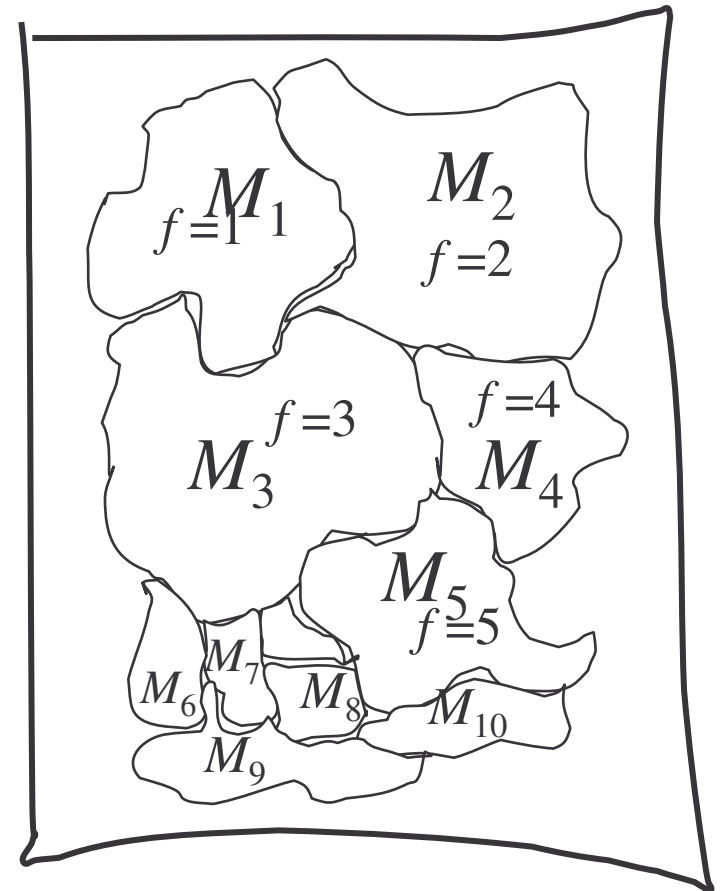
- Advantage still  $\geq \varepsilon/2$

$\Rightarrow$  some pair  $E(M_y), E(M_z)$  are far

- Contradicts indistinguishability for

$$t = n - \lambda - \log(1/\varepsilon)$$

- Save loss in entropy via balancing & Goldreich-Levin (tricky!)



# Recall: Indistinguishability

Def:  $(\lambda, \epsilon)$ -entropically secure if  $\forall M, H_\infty(M) \geq n - \lambda, \forall A \forall g$   
 $\exists A' : | \Pr[A(E(M)) = g(M)] - \Pr[A' = g(M)] | \leq \epsilon$

Def:  $(t, \epsilon)$ -indistinguishable (IND) if  $\forall M_0, M_1, H_\infty(M_b) \geq t$ :  
 $E(M_0) \approx_\epsilon E(M_1)$

**Proposition:**  $(\lambda, \epsilon)$ -ES equiv. to  $(t, \epsilon')$ -IND for  $t = n - \lambda - 1$

- What does this say?
  - Randomness extractors hide all functions of their source.
- How can we use this?
  - Extractors with “invertibility” give encryption schemes

# Outline

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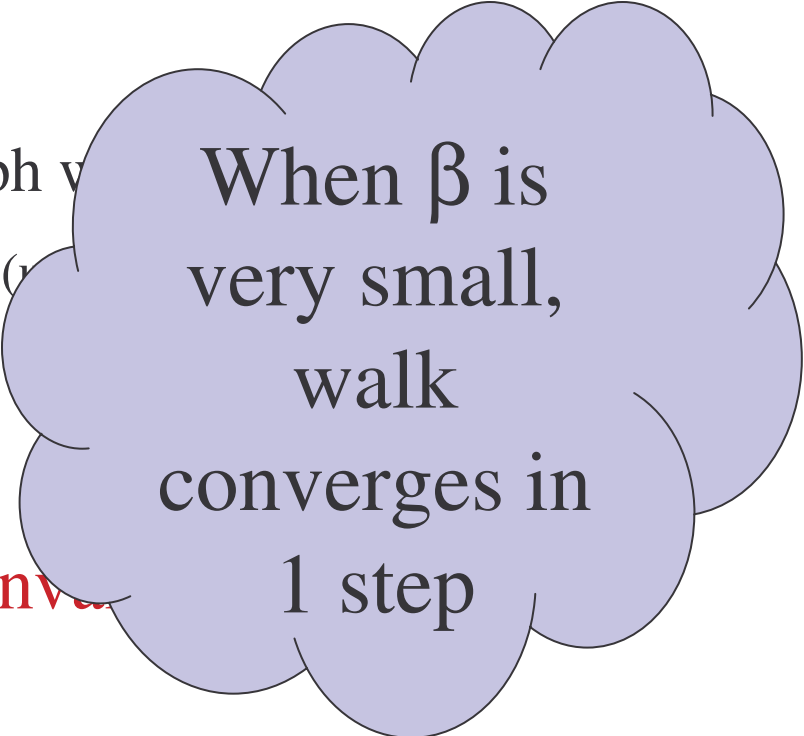
- Equivalent Definitions:
  - Hiding all functions
  - Indistinguishability
  - **Intuition**: entropic security  $\approx$  randomness extraction
- Two Simple, General Constructions (improve [RW02])
  - Step on expander graph
  - Hashing
- Lower Bounds

# Expander Graphs

- Important tool in ... everything.
- Expander = regular, undirected graph with  $n$  vertices
  - Let  $A$  = adjacency matrix of  $d$ -regular graph
  - Vector  $(1, \dots, 1)$  has eigenvalue  $d$
  - Other eigenvalues  $\in [-d, d]$
- $G$  is a  $\beta$ -expander if other eigenvalues  $\in [-\beta, \beta]$
- Random walks converge quickly:

**Fact:** If  $H_\infty(p) \geq t$ , then walk is  $\epsilon$ -far from uniform after at most

$$\frac{n - t + 2 \log(1/\epsilon)}{2 \log(1/\beta)} \quad \text{steps, where } |G| = 2^n.$$



When  $\beta$  is very small, walk converges in 1 step

# Using Graphs for Encryption

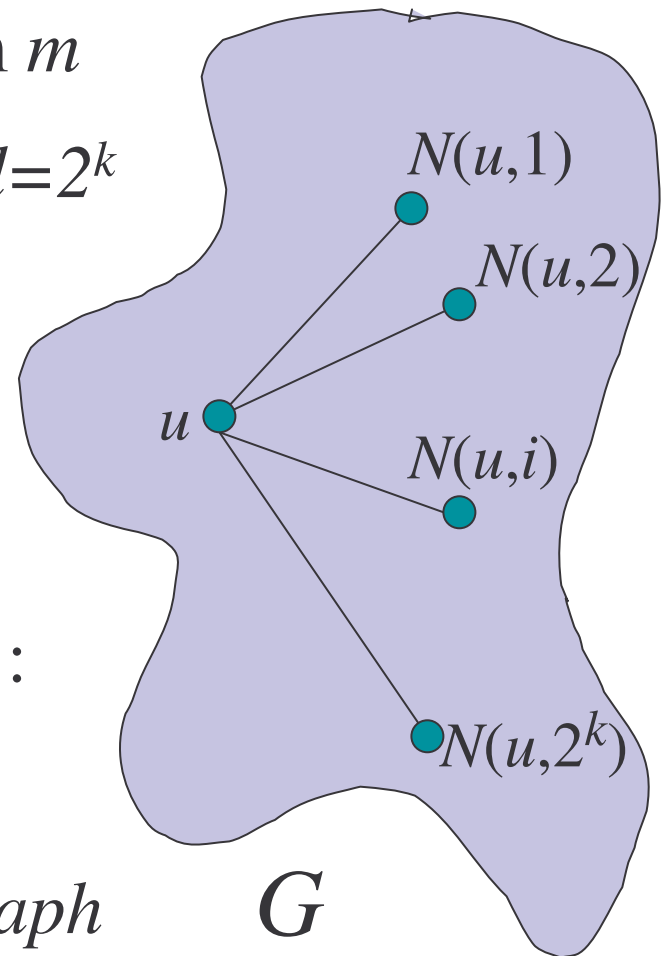
- Encryption of  $m =$  random step from  $m$
- Take regular  $G$  with  $V = \{0,1\}^n$  and  $d = 2^k$
- Consider  $E(m,s) = N(m,s)$   
(  $N(u,i) = i^{\text{th}}$  neighbour of node  $u$  )

**Q:** When can you decrypt?

**A:** Need labeling  $N$  with an **inverter**  $N'$ :

$$N'(N(u,i), i) = u$$

**Exercise:** *Every regular undirected graph has an invertible labeling.*



# Using Graphs for Encryption

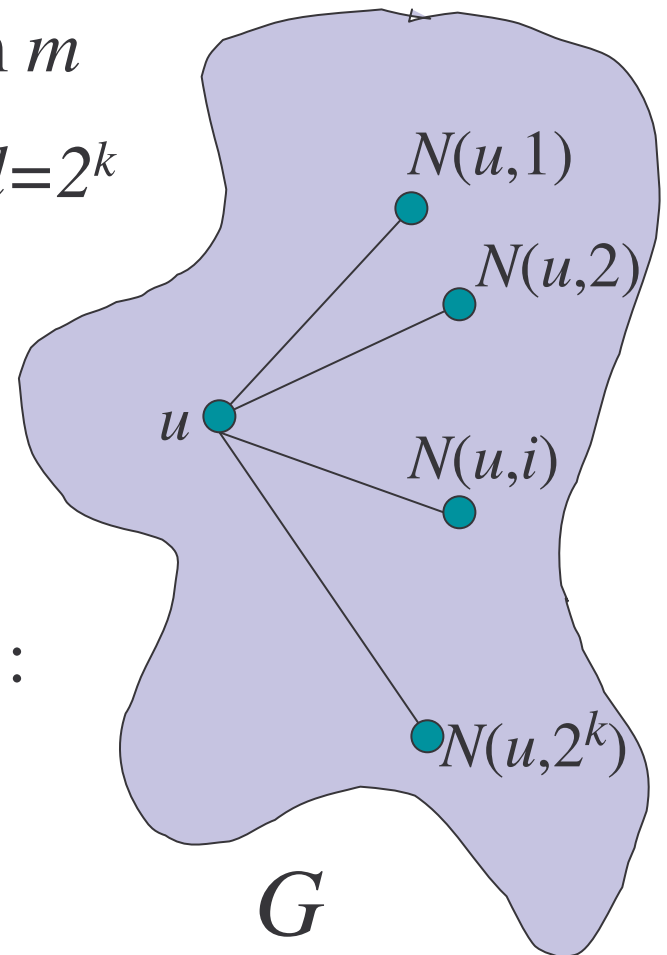
- Encryption of  $m =$  random step from  $m$
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**Q:** When can you decrypt?

**A:** Need labeling  $N$  with an **inverter**  $N'$ :

$$N'(N(u,i), i) = u$$

**Easier exercise:** *Cayley graphs are invertible.*



# Tangent: Cayley Graphs

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- Let  $(V, *)$  be a group,  $B = \{g_1, \dots, g_d\}$  a set of generators.

**Cayley graph for  $(V, *, B)$**  has vertex set  $V$  and edges:

$$E = \{ (u, g * u) \mid u \in V, g \in B \}.$$

- Graph is undirected if  $B$  contains its inverses.
  - E.g. hypercube  $\{0,1\}^n$  with  $B = \{\text{vectors of weight 1}\}$
- Natural labeling is  $N(u, i) = g_i * u$
- Invertible since  $N'(w, i) = g_i^{-1} * w$
- Graphs in this talk are Cayley graphs



# Using Graphs for Encryption

- Take regular  $G$  with  $V=\{0,1\}^n$  and  $d=2^k$
- Consider  $E(m,s) = N(m,s)$   
(  $N(u,i) = i^{\text{th}}$  neighbour of node  $u$  )

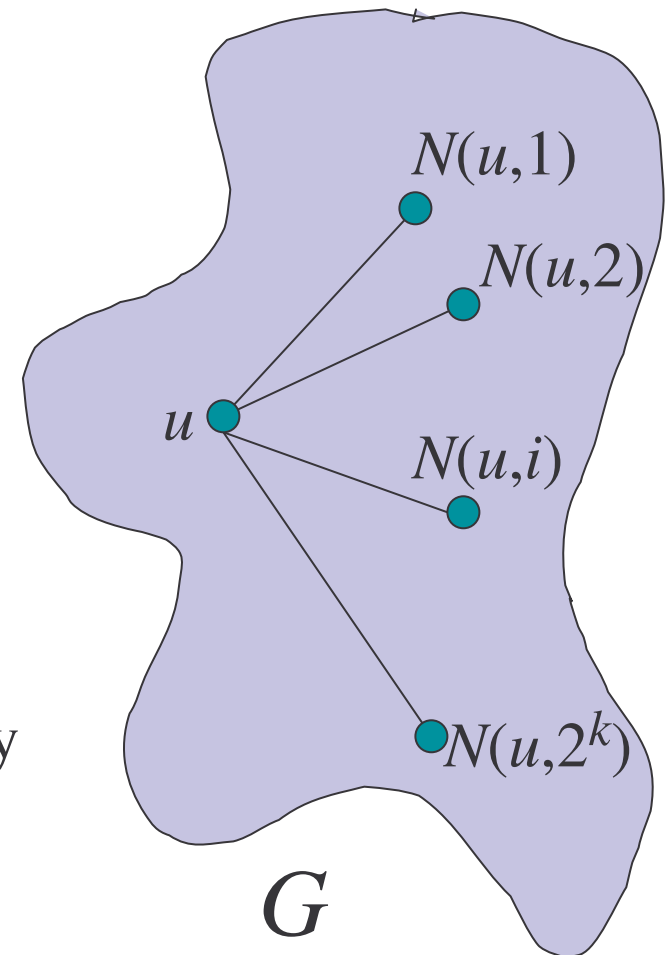
**Q:** When is  $E(t,\epsilon)$ -indistinguishable?

**A:** When walk converges in 1 step.

*Sufficient:*  $G$  is  $\beta$ -expander with  $\beta^2 \leq \epsilon^2 2^{t-n}$

**Theorem[LPS]:** There exist (explicit) Cayley graphs with  $\beta^2 \approx 1/d = 2^{-k}$

**Corollary:** There exist  $(\lambda, \epsilon)$ -ES encryption schemes with  $k \approx \lambda + 2 \log(1/\epsilon)$



## [RW02]: Two constructions

1.  $E(m,s) = m \oplus b(s)$ , with  $b : \{0,1\}^k \rightarrow \{0,1\}^n$ .
  - $b(\cdot)$  is carefully chosen: range is “ $\delta$ -biased set”
  - Fourier-based proof works only for **uniform** message
  - $k \approx 2 \log n + 3 \log (1/\epsilon)$  (here  $\lambda = 0$ )

2.  $E(m,s; i) = (\phi_i, \phi_i(m) + s)$

- $\{\phi_i: \{0,1\}^n \rightarrow \{0,1\}^n\}$  are 3-wise independent permutations
- $k \approx \lambda + 3 \log (1/\epsilon)$  (works for all  $\lambda$ )
- $3n$  bits of additional randomness, difficult proof

# [RW02]: First construction

1.  $E(m,s) = m \oplus b(s)$ , with  $b : \{0,1\}^k \rightarrow \{0,1\}^n$ .
  - $b(\cdot)$  is carefully chosen: range is “ $\delta$ -biased set”
  - Fourier-based proof works only for **uniform** message
  - $k \approx 2 \log n + 3 \log (1/\epsilon)$  (here  $\lambda = 0$ )

## Same scheme, new analysis:

- $G =$  Cayley graph for  $\{0,1\}^n$  with generators  $\{b(s) \mid s \in \{0,1\}^k\}$
- Observe that  $G$  is a  $\delta$ -expander (degree =  $n^2/\delta^2$ ) (e.g. [BGSW])
- Previous slide  $\Rightarrow k = \lambda + 2 \log n + 2 \log (1/\epsilon)$   
(Same proof works for all  $\lambda$ )

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# Two General Constructions

#1 : Steps on an expander graph

#2: Random Hashing (not here)

# Outline

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- Equivalent Definitions:
  - Hiding all functions
  - Indistinguishability
  - **Intuition**: entropic security  $\approx$  randomness extraction
- Two Simple, General Constructions (improve [RW02])
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# Lower Bounds

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- Lower Bound via Shannon Bound:

$$k \geq \lambda$$

- Lower bound via lower bounds on extractors:

$$k \geq \lambda + \log(1/\epsilon)$$

- Requires that extra randomness be public, i.e.

$$E(m,s;i) = (i, E'(m,s;i))$$

- All the schemes discussed fit this framework

# Simple Lower Bound

Def:  $(\lambda, \epsilon)$ -entropically secure if  $\forall M, H_\infty(M) \geq n - \lambda, \forall A \forall \text{pred. } g$   
 $\exists A' : | \Pr[A(E(M)) = g(M)] - \Pr[A' = g(M)] | \leq \epsilon$

**Proof** (reduce to bounds on regular encryption):

- $\forall w \in \{0,1\}^\lambda$ , define distribution  $M_w = w \parallel U_{n-\lambda}$   
(i.e.:  $M_w = w$  followed by  $n - \lambda$  random bits)
- Indistinguishability  $\Rightarrow \forall v, w: E(M_v) \approx_\epsilon E(M_w)$
- This is regular encryption (non-entropic) of  $w$  !
- Need  $k \geq \lambda$

# Conclusions

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- Systematic study of **entropic security** [CMR98,RW02]
  - Stronger definition + characterization as **indistinguishability**
  - Extractors hide all functions of their source!
  - Simple constructions, proofs, lower bounds
- **Computational question**: preserve running time?
- In what **other contexts** is ES interesting?
  - Password Hashing [CMR98]: similar definition
  - Error Correction (bounded storage, noisy keys) (STOC 05)
  - Database Privacy