

On the **Assumptions** used for **Obfuscation**

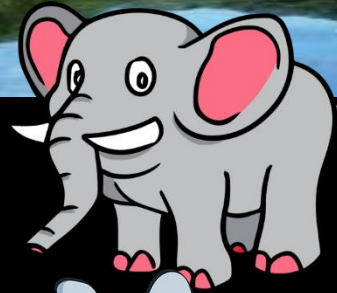
Benny Applebaum

Tel Aviv University

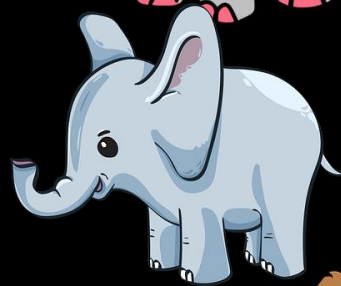
New Developments in Obfuscation

Simons Institute, December 2020

Obfuscation

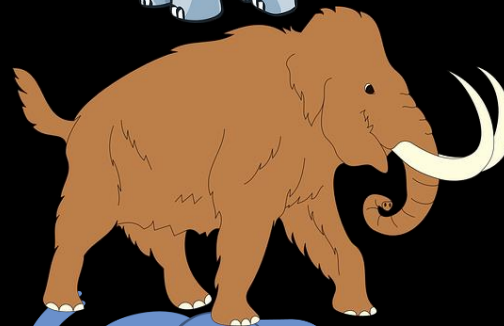


SXDH



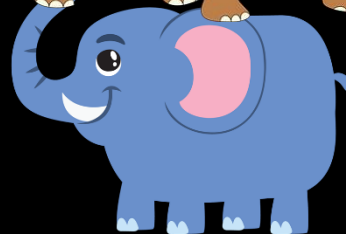
LPN
(mod-q)

PKE
Assumptions
(Homomotopia)



Local PRGs

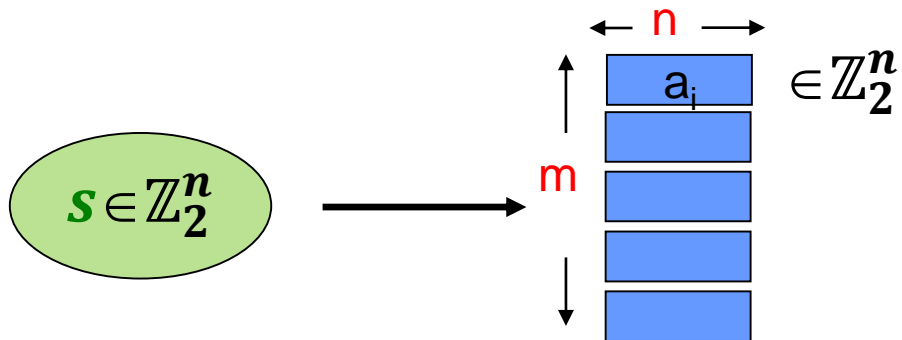
Cheap
pseudorandomness
(Fast-mini-Crypt)



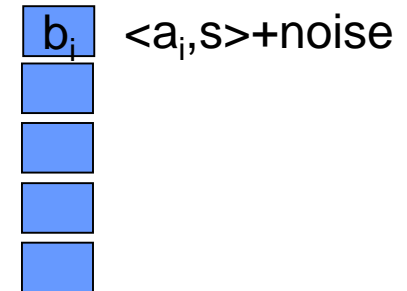
LWE

Learning Parity with Noise [BFKL94]

Problem: find s

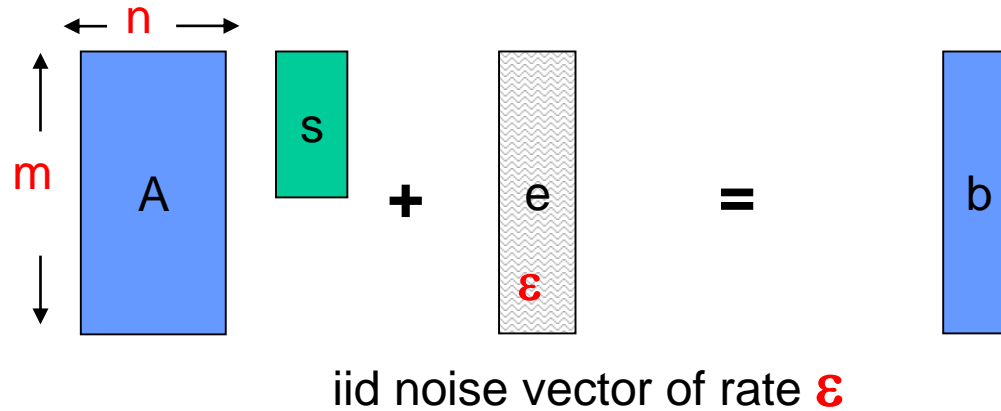


iid noise:
each bit is 1 w/prob. $\epsilon < 0.5$



Decoding Random Linear Code [GKL88]

Problem: find s



- Information theoretic solvable when $m > n/(1 - H(\epsilon))$
- Gets “easier” when m grows and ϵ decreases
 - Solving LPN(m, ϵ) \Rightarrow Solving LPN($m + m', \epsilon - \epsilon'$)
- Trivially solvable in time $2^{H(\epsilon)n}$
- Trivially solvable w/p $(1 - \epsilon)^n < 1 - \epsilon n$

Known Attacks

Samples
(m)

$$\exp\left(\frac{n}{\log n}\right)$$

$$n^{1+c}$$

$$O(n)$$

poly-LPN

const-LPN

Noise

$$\frac{\log n}{n} \quad \frac{\log^2 n}{n}$$

$$\frac{1}{n^{0.9}} \quad \frac{1}{n^{0.5}} \quad \frac{1}{n^{0.1}}$$

0.25

0.5

Known Attacks

Samples
(m)

$$\exp\left(\frac{n}{\log n}\right)$$

$$n^{1+c}$$

$$O(n)$$

$$\exp\left(\frac{n}{\log n}\right) \quad [\text{BKW03}]$$

$$\exp\left(\frac{n}{\log \log n}\right) \quad [\text{Lyu05}]$$

Quasi-Poly

Sub-Exp
 $\exp(n^{1-\delta})$

Exp
 $\exp(n)$

Poly-time
[BK02,
APY09]

SZK
worst->avg
[BLVW18]

PKE
[Ale03]

Non-Trivial attacks
+ implication
[BJMM12,AIK04]

Noise

$$\frac{\log n}{n} \quad \frac{\log^2 n}{n}$$

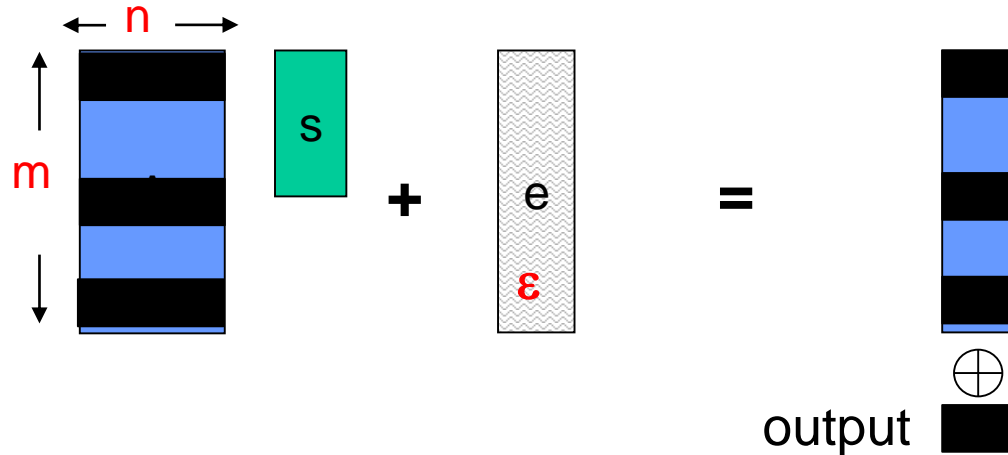
$$\frac{1}{n^{0.9}} \quad \frac{1}{n^{0.5}} \quad \frac{1}{n^{0.1}}$$

0.25

0.5

Simple Distinguishing Attack

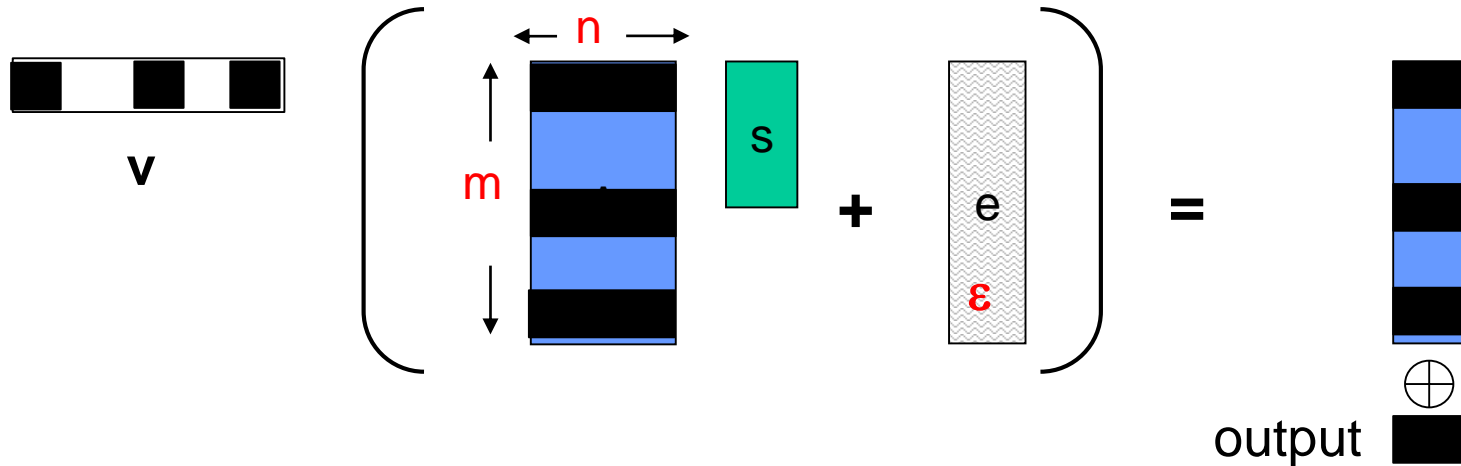
Goal: Distinguish (A, b) from $(A, \text{uniform})$



1. Find “small” set of linearly dependent rows in A

Simple Distinguishing Attack

Goal: Distinguish (A, b) from $(A, \text{uniform})$



1. Find “small” set of linearly dependent rows in A
 Δ -weight vector \mathbf{v} in $\text{co-Kernel}(A)$

2. Output $\langle \mathbf{v}, b \rangle = \langle \mathbf{v}, e \rangle$

Distinguishing advantage $(0.5 - \epsilon)^\Delta = \exp(-\Delta/\epsilon)$

How small is $\Delta = \Delta(n, m)$? $\tilde{O}\left(\frac{n}{\epsilon \log m}\right)$

Ignoring complexity of finding $\mathbf{v} \Rightarrow$ overall complexity \exp in $\tilde{O}\left(\frac{n}{\epsilon \log m}\right)$

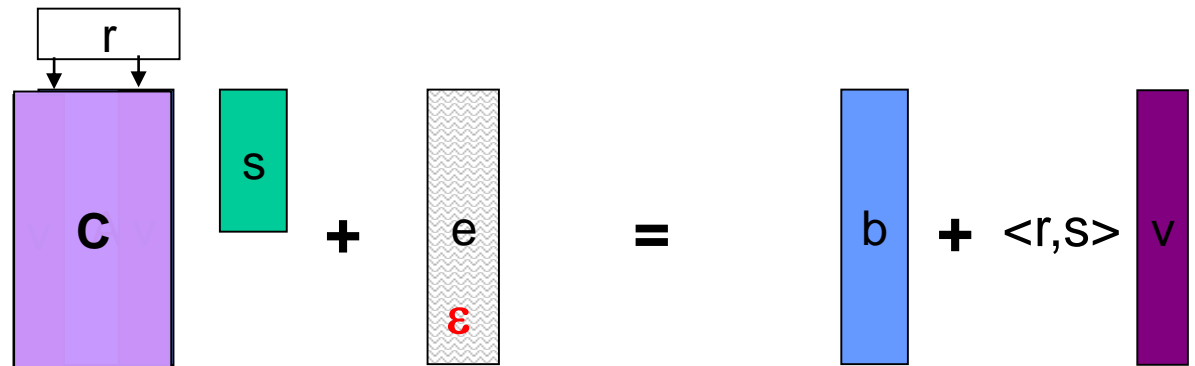
Pseudorandomness

Thm. [BFKL94] LPN \Rightarrow pseudorandomness $(A, As+e) \approx (A, U_m)$

Proof: [AIK07]

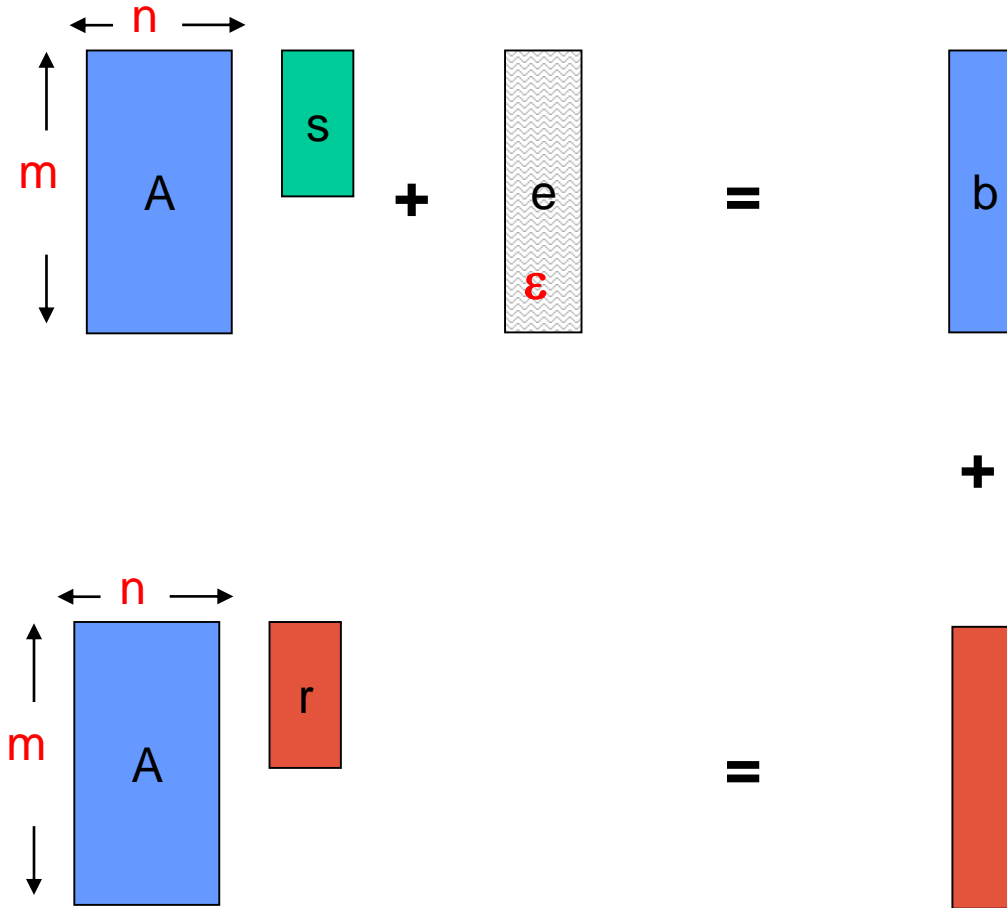
- Assume LPN \Rightarrow By [GL89] can't approximate $\langle s, r \rangle$ for a random r
- Use distinguisher D to compute hardcore bit $\langle s, r \rangle$ given a random r
 - Given $(A, b=As+e)$ and $r \in \{0,1\}^n$ define $C = re\text{-random}(A)$ s.t:

$$C \text{ is random and } \mathbf{b} = \begin{cases} \text{Uniform} & \text{if } \langle r, s \rangle = 1 \\ Cs+e & \text{if } \langle r, s \rangle = 0 \end{cases}$$



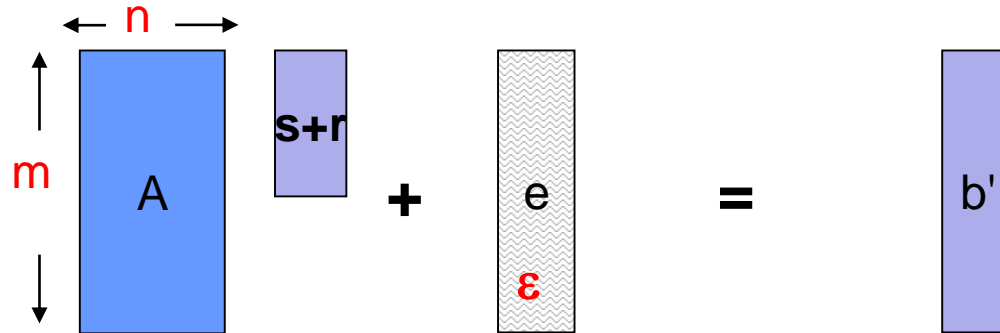
Random Self-Reducibility

Problem: find s



Random Self-Reducibility

Problem: find s



Dual Version: Syndrome Decoding

Problem: find s

$$\begin{matrix} \leftarrow n \rightarrow \\ \uparrow m \\ \downarrow \end{matrix} \begin{matrix} \text{A} \\ \text{A} \end{matrix} \begin{matrix} \text{s} \\ \text{s} \end{matrix} + \begin{matrix} \text{e} \\ \text{e} \\ \epsilon \end{matrix} = \begin{matrix} \text{b} \\ \text{b} \end{matrix}$$

iid noise vector of rate ϵ

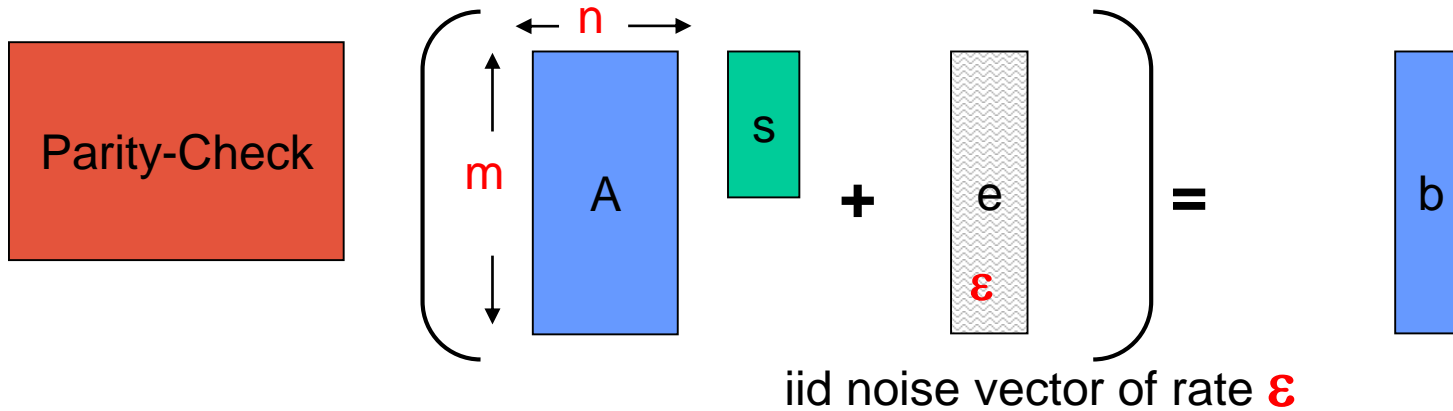
Problem: find e

$$\begin{matrix} \leftarrow m \rightarrow \\ \uparrow m-n \\ \downarrow \end{matrix} \begin{matrix} \text{Parity-Check} \\ \text{Parity-Check} \end{matrix} \begin{matrix} \text{e} \\ \text{e} \\ \epsilon \end{matrix} = \begin{matrix} \text{ } \\ \text{ } \end{matrix}$$

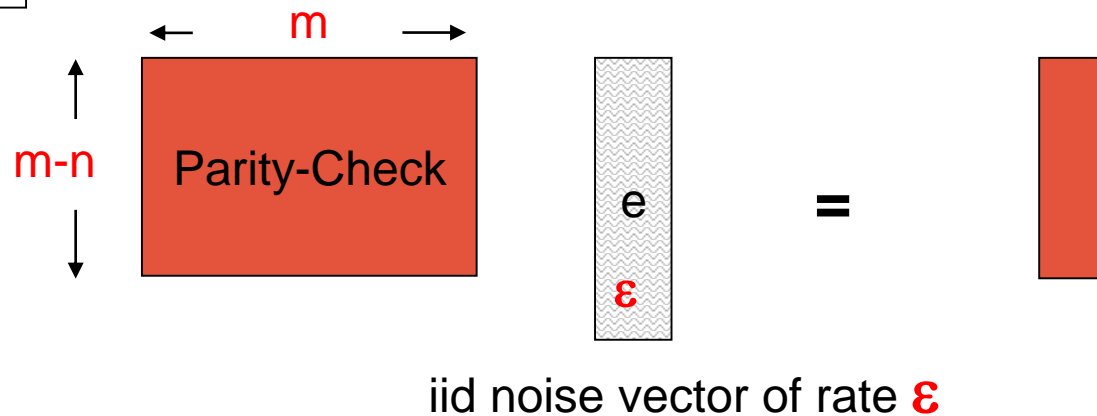
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Dual Version: Syndrome Decoding

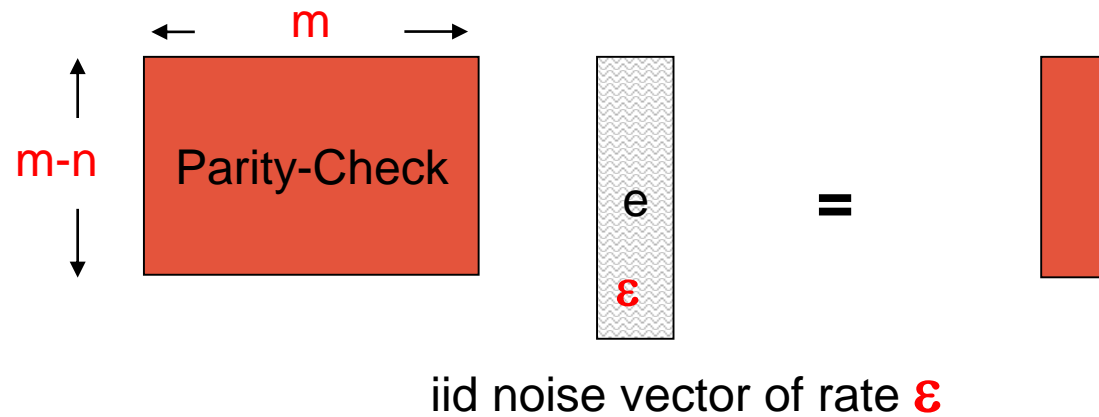
Problem: find s



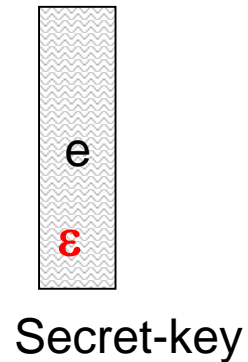
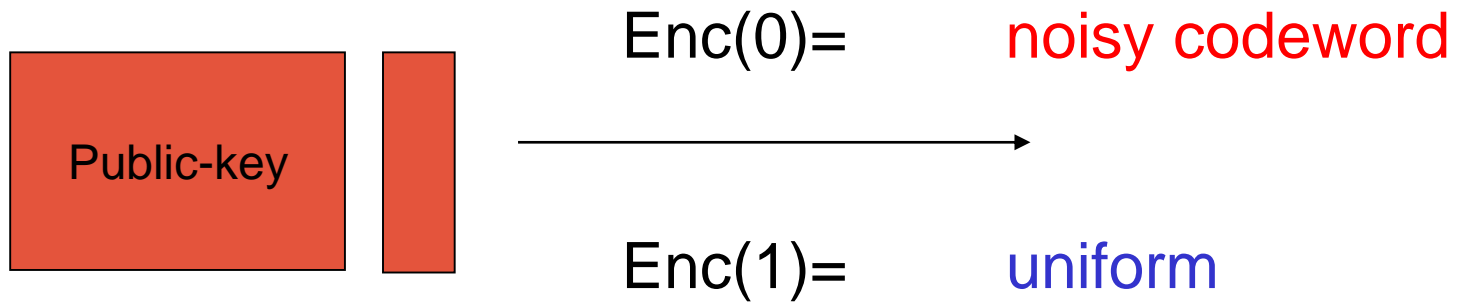
Problem: find x



Corollary: Planting Short Vector in Kernel



Public-Key Encryption [Alek03]



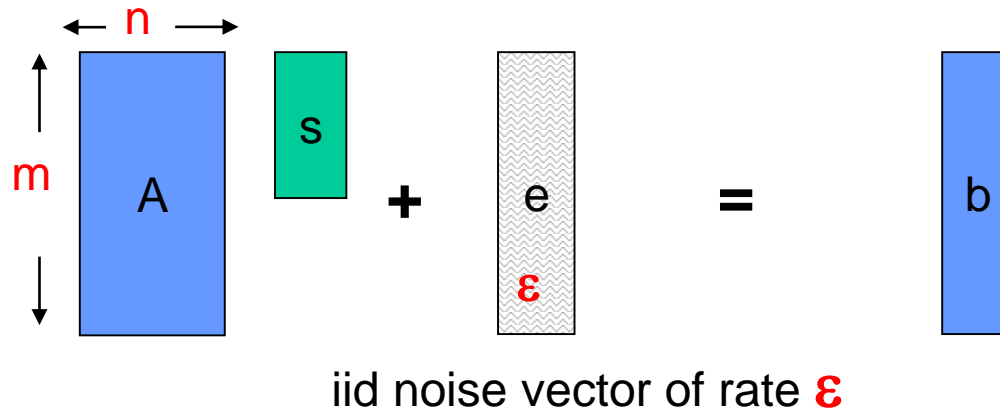
LPN: Evidence for Hardness

- Search problem, Random-Self Reducibility
- Gaussian-Elimination is noise sensitive
- Well studied in learning/coding community for some parameters
 - “Win-Win” results
 - Provably resist limited attacks
- Robust (Search-to-Decision, leakage-resilient, low-weight secret, circularity)
[BFKL93,AGV09, DKL09, ACPS09, GKPV10, ...,] See Pietrzak’s survey
- Seems hard even for Quantum algorithms and co-AM algorithms
- “Simple mathematical domain” (compare with factoring/group-based crypto)

LPN: Features

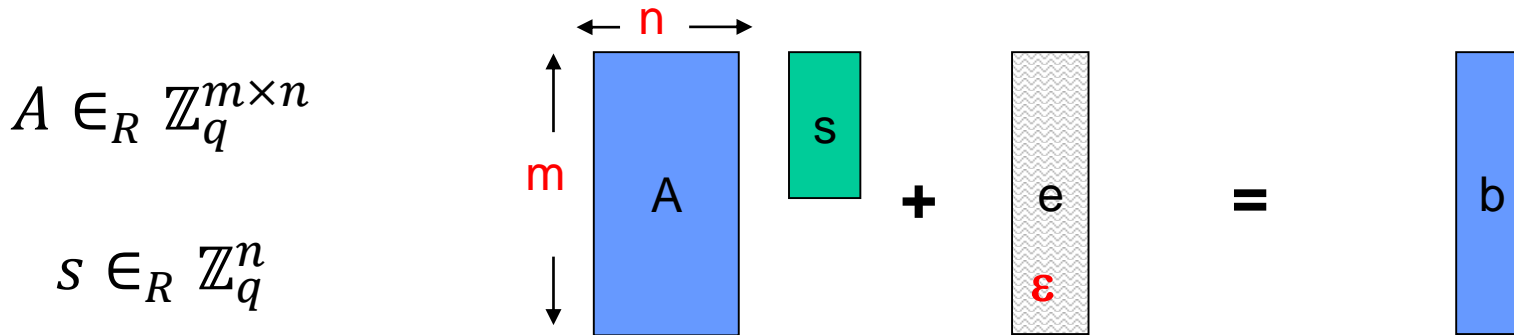
- Simple algebraic structure: “almost linear” function
- Computable by simple (bit) operations
 - exploited by [HB01, ...]

Variants



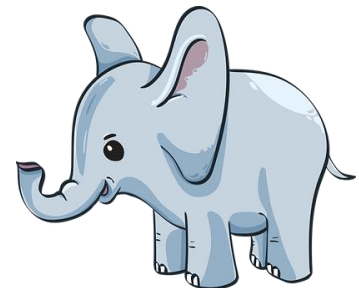
- Under-constraint case (\Rightarrow hashing [AHIKV17])
- Changing the matrix distribution
 - Make sure that $\Delta(A)$ is not too small
- Noise distribution
 - Fixed weight vector (OK)
 - Structured Noise (may be subject to linearization [AG11])
- Larger Alphabet
 - Noise: Gaussian vs **Bernoulli**

“LPN” over \mathbb{Z}_q

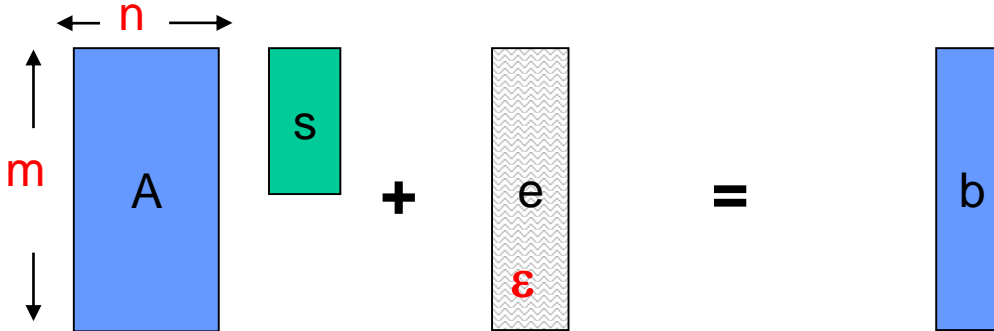


$$e_i = \begin{cases} U_q & \text{w.p } \epsilon \\ 0 & \text{w.p } 1 - \epsilon \end{cases}$$

- Decoding over the q -ary symmetric channel (Random-Linear-Code)
- Support(x) = sequence of iid Bernoulli variables
 - Lifting binary-crypto to Arithmetic Crypto [IPS09, AAB15, ADINZ17, BCGI18...]
- Search-RLC(q, n, m, ϵ): hard to find s
- Decision-RLC(q, n, m, ϵ): $(A, b) \approx (U_q^{m \times n}, U_q^m)$
- Equivalence not known when q is super-polynomial



“LPN” over \mathbb{Z}_q

$$A \in_R \mathbb{Z}_q^{m \times n}$$
$$s \in_R \mathbb{Z}_q^n$$

$$As + e = b$$

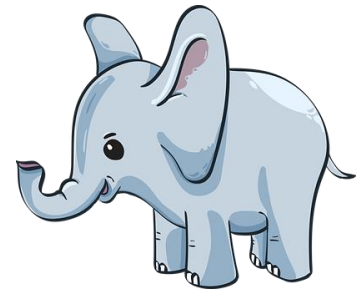
$$e_i = \begin{cases} U_q & \text{w.p } \epsilon \\ 0 & \text{w.p } 1 - \epsilon \end{cases}$$

Seems as hard as binary version (harder?)

- Noisy Linear Algebra is hard
- Large $q \Rightarrow$ less noise cancelations

Powerful assumption: Effective secret is $O_\epsilon(n)$ **bits**
but stretch is $\Omega_\epsilon(m)$ **field elements**

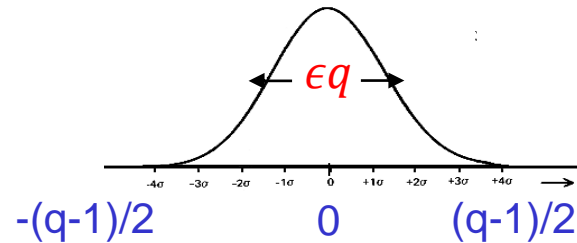
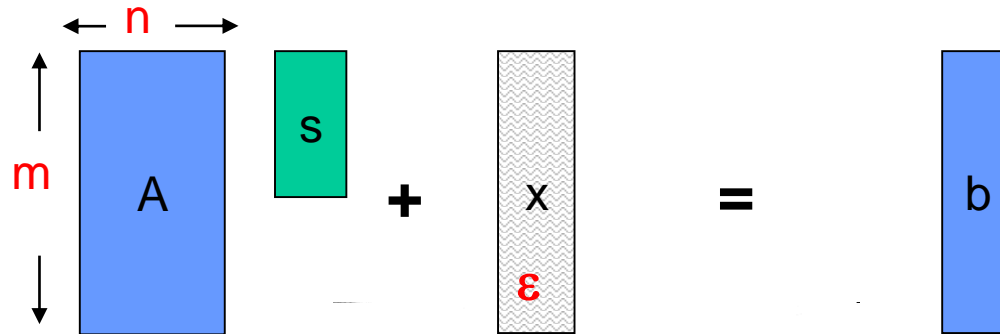
Requires further study especially for polynomial regime



Learning with Errors Variant [Regev05]

$$A \in_R \mathbb{Z}_q^{m \times n}$$

$$s \in_R \mathbb{Z}_q^n$$

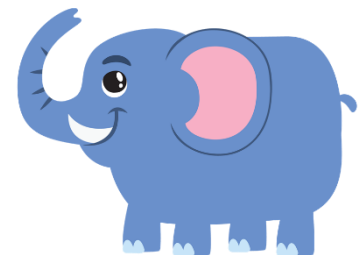


Mainstream Crypto Assumption

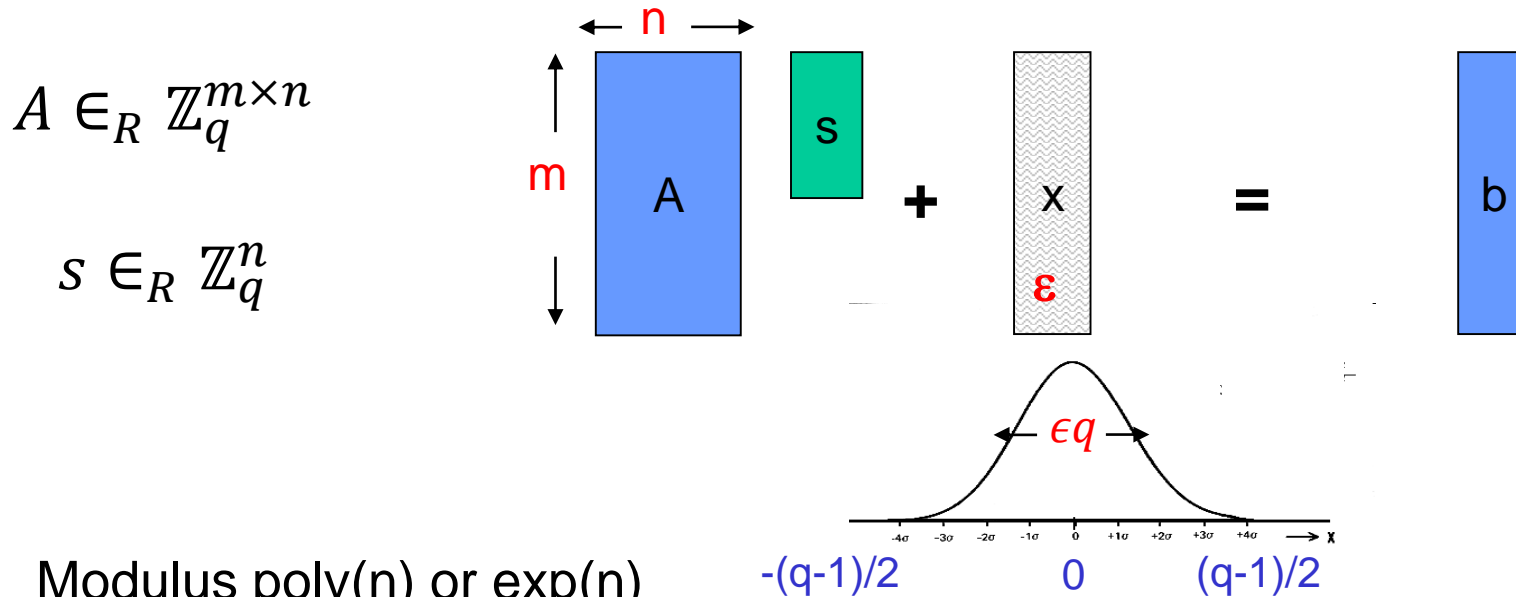
Noise induces geometry



different game



Learning with Errors Variant [Regev05]



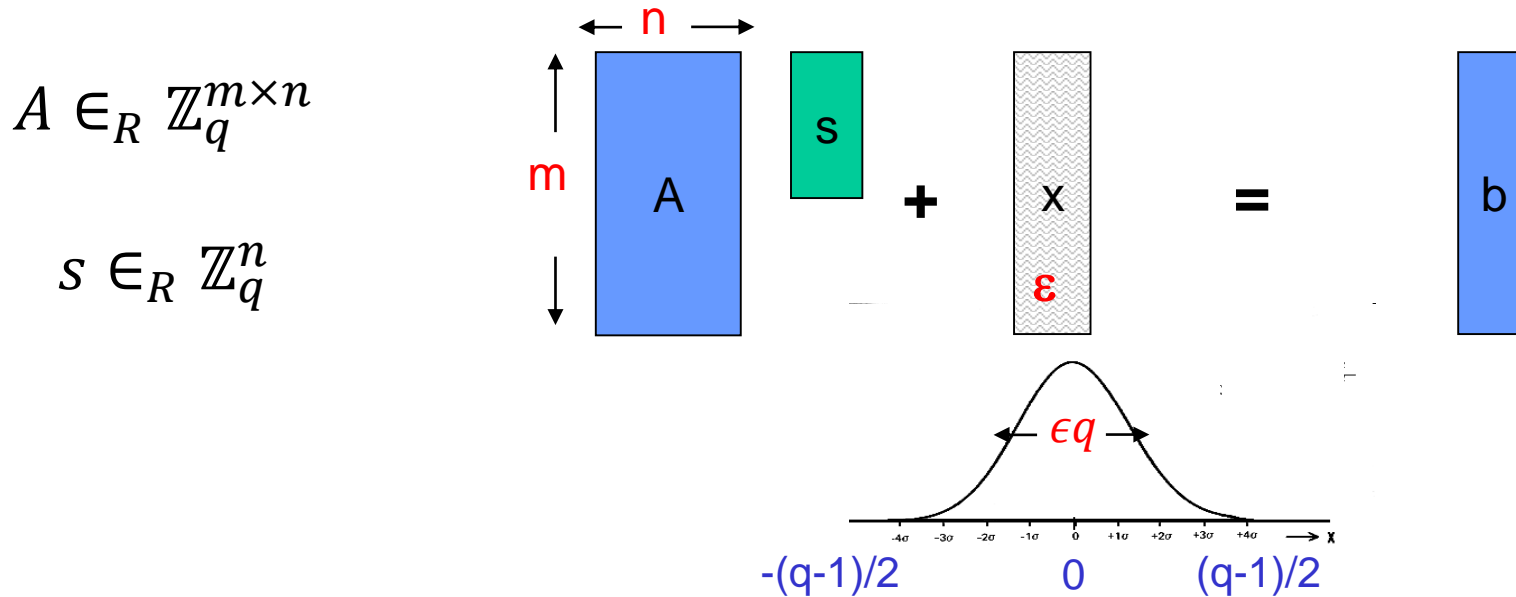
- Modulus $\text{poly}(n)$ or $\exp(n)$
- Noise $1/\text{poly}(n)$ or $1/\text{sub-exponential}$

As hard as worst-case Lattice problems (GAP-SVP) [Reg05, Peik09]

- Approximation factor $\tilde{O}(n/\epsilon)$
- exp-approximation easy via [LLL82]

Believed to be sub-exp secure even against Quantum adversaries

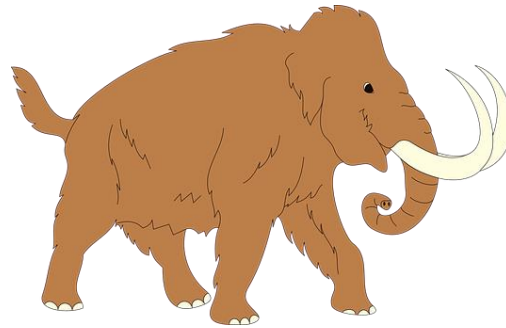
Learning with Errors Variant [Regev05]



Low noise \Rightarrow Can repeatedly add noise vectors

- Unlike the Bernoulli variant
- Generate additional equations for free
- Key to many applications [GPV08, ...,BV11,...]
- Puts the problem in SZK (“co-NP attacks”) [GG98,MV03]

Local PRGs

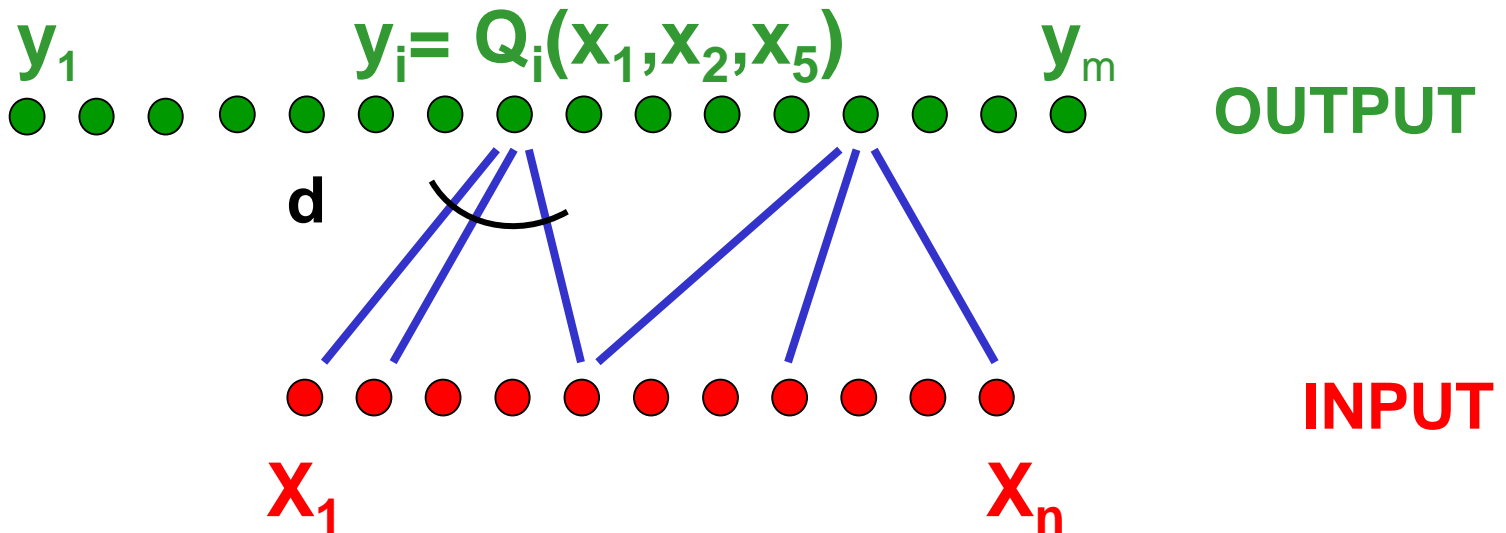


Locally Computable Functions (NC⁰)

Each output depends on constant number of inputs

Function defined by:

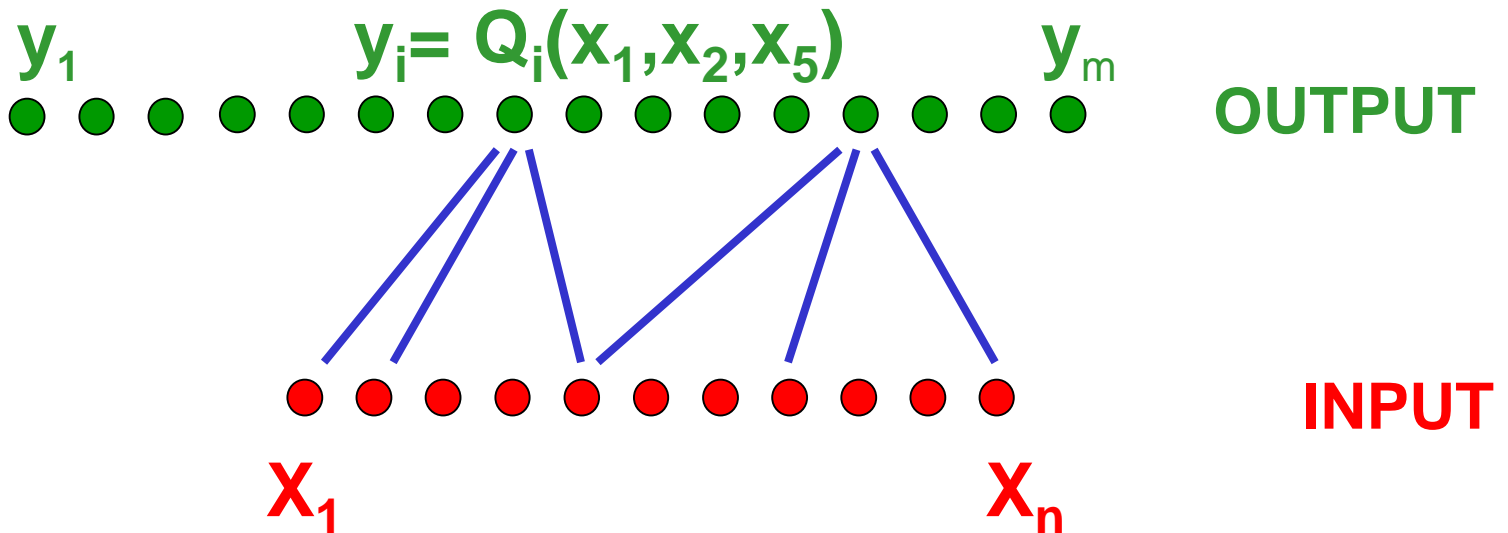
- (m,n,d) graph G
- List of d -local predicates $Q_1, \dots, Q_m: \{0,1\}^d \rightarrow \{0,1\}$



Locally-Computable PRGs?

Long line of works [CM01,MST02,AIK04,....] see survey [A13]

Stretch matters!

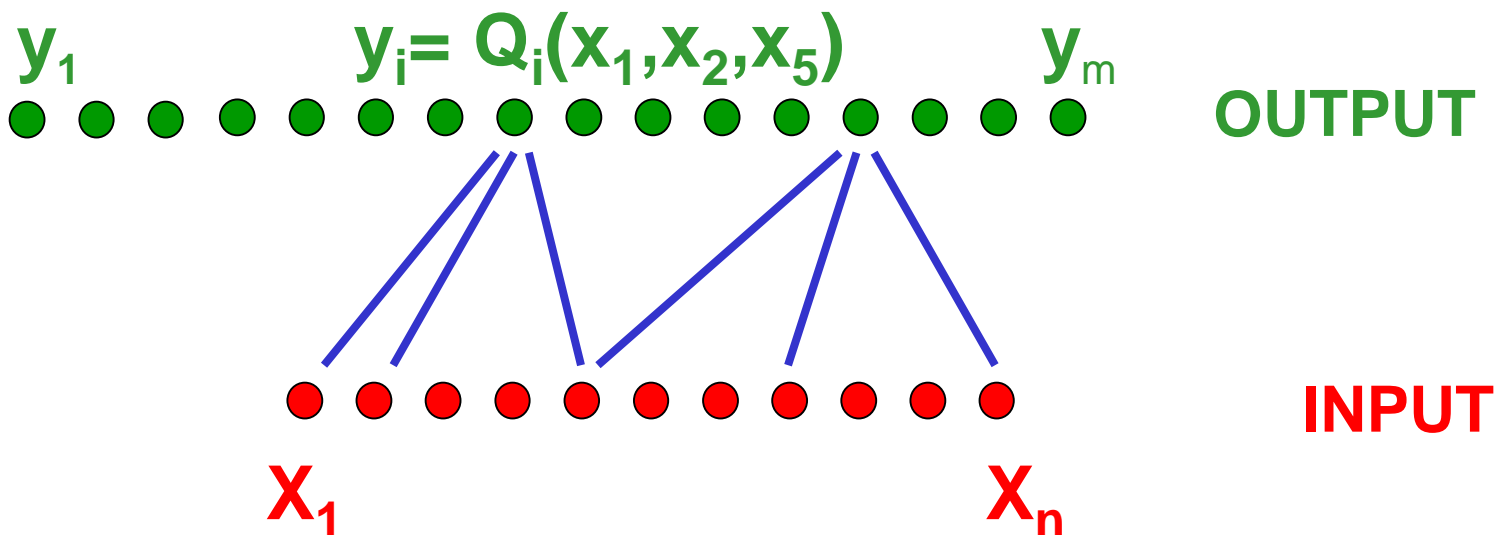


Sub-Linear Local PRG in NC^0

Stretch: $m = n + n^{1-\epsilon}$

Follows from any OWF in NC^1 [AIK04]

- Most standard cryptographic assumptions
- Lattices, DLOG, factoring, LPN, asymptotic DES/AES



Lin-PRG in NC^0

Linear Stretch: $m = (1 + \epsilon)n$

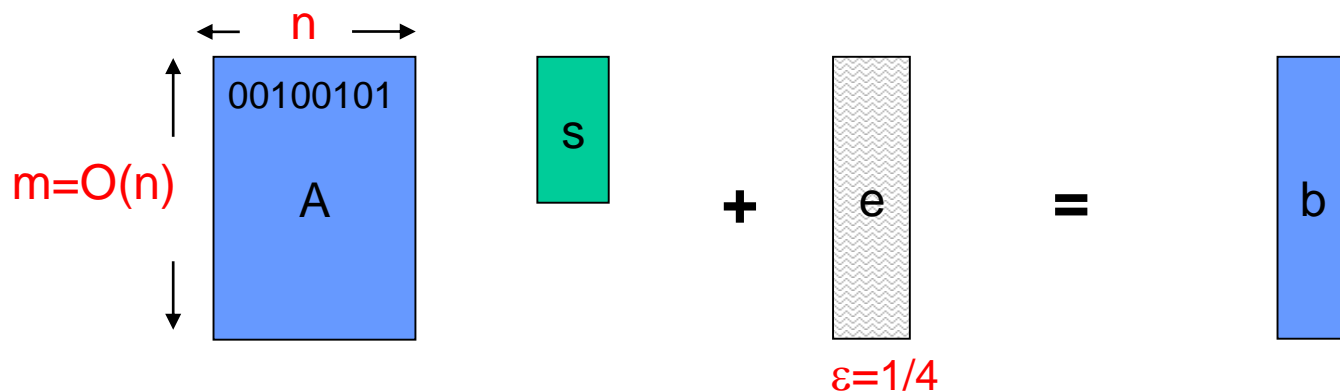
Follows from LPN over sparse matrix [AIK07]

- Assumption made by [Alek03]
- Implies hardness of refuting 3-SAT [Feige02]

Random Sparse Matrix

or

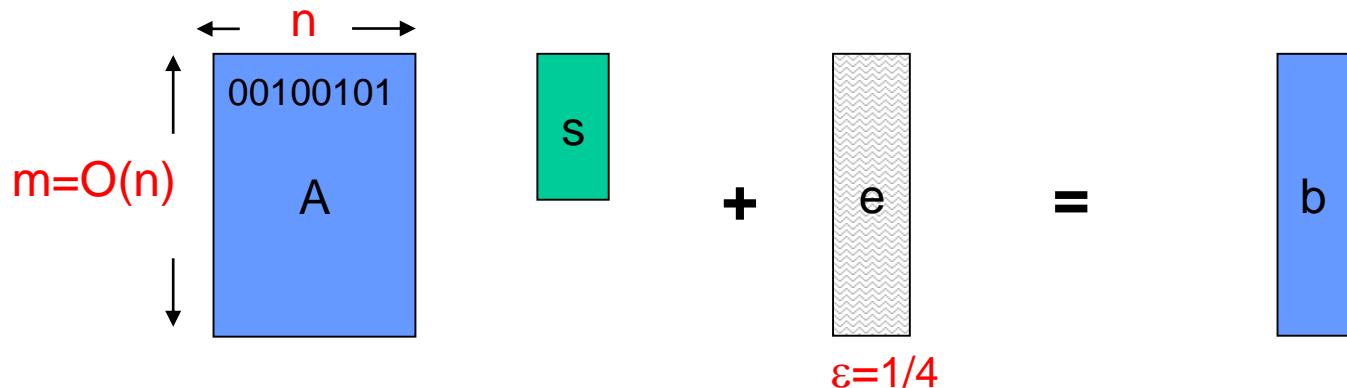
Any sparse expanding matrix



Lin-PRGs in NC^0

[A-17] Also follows from other assumptions

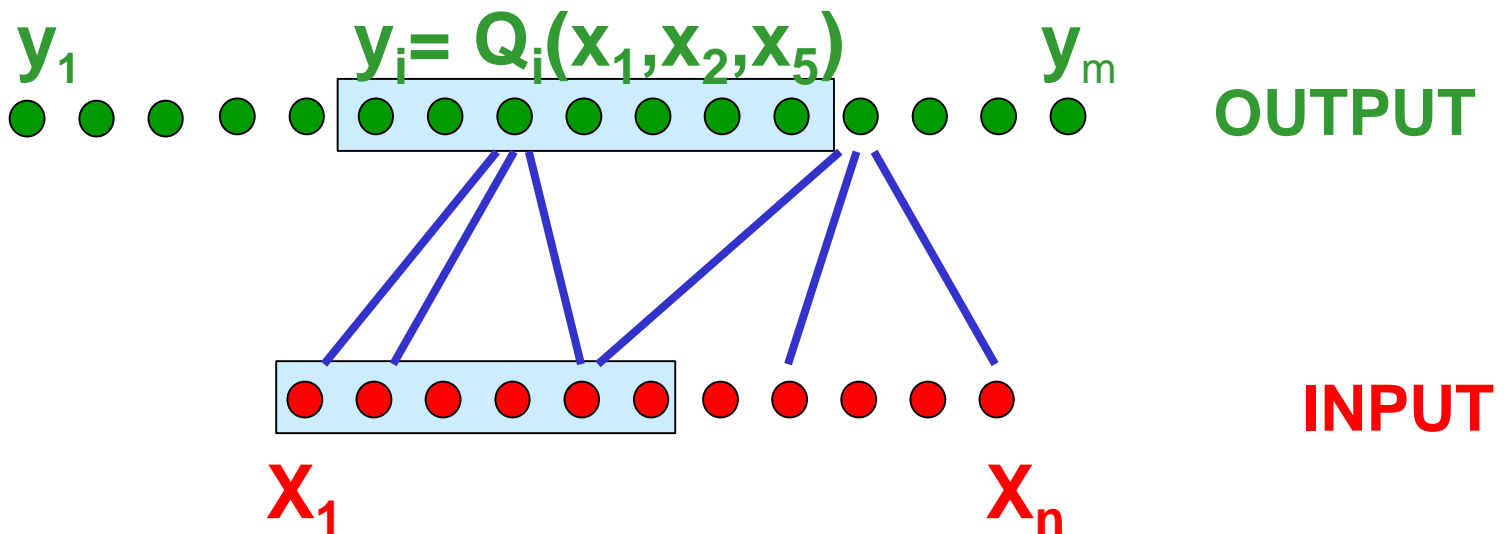
- Any exponentially-hard regular Local OWF (e.g., [Gol00])
- Exp-hard LPN over $O(n)$ -time computable code, e.g., [DI14]



Lin-PRGs in NC^0

Generic attack [AIK07]

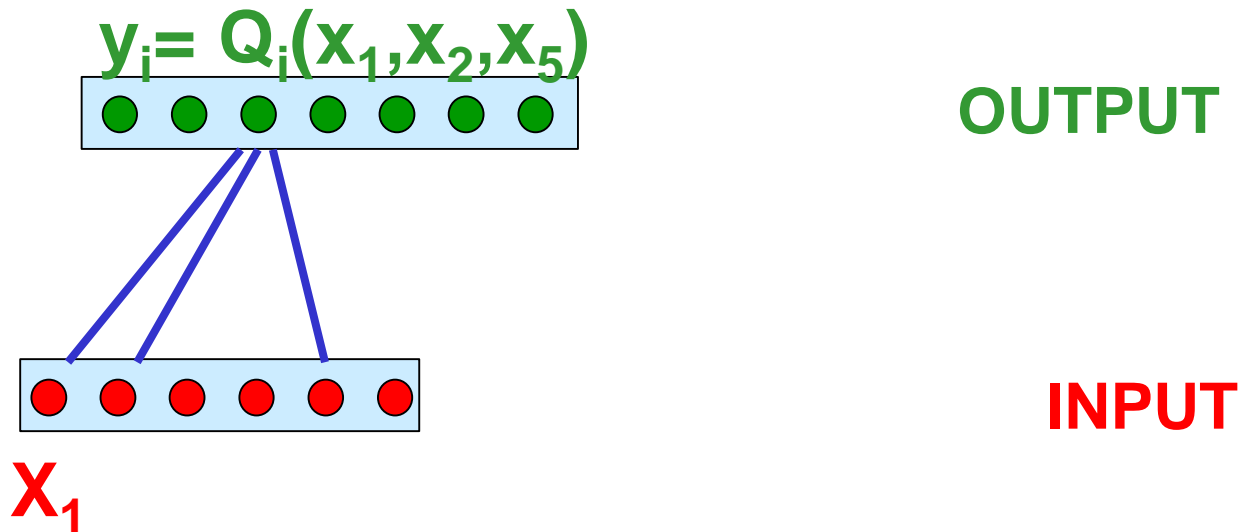
- Find shrinking set
- Enumerate over projected seed



Lin-PRGs in NC^0

Generic attack [AIK07]

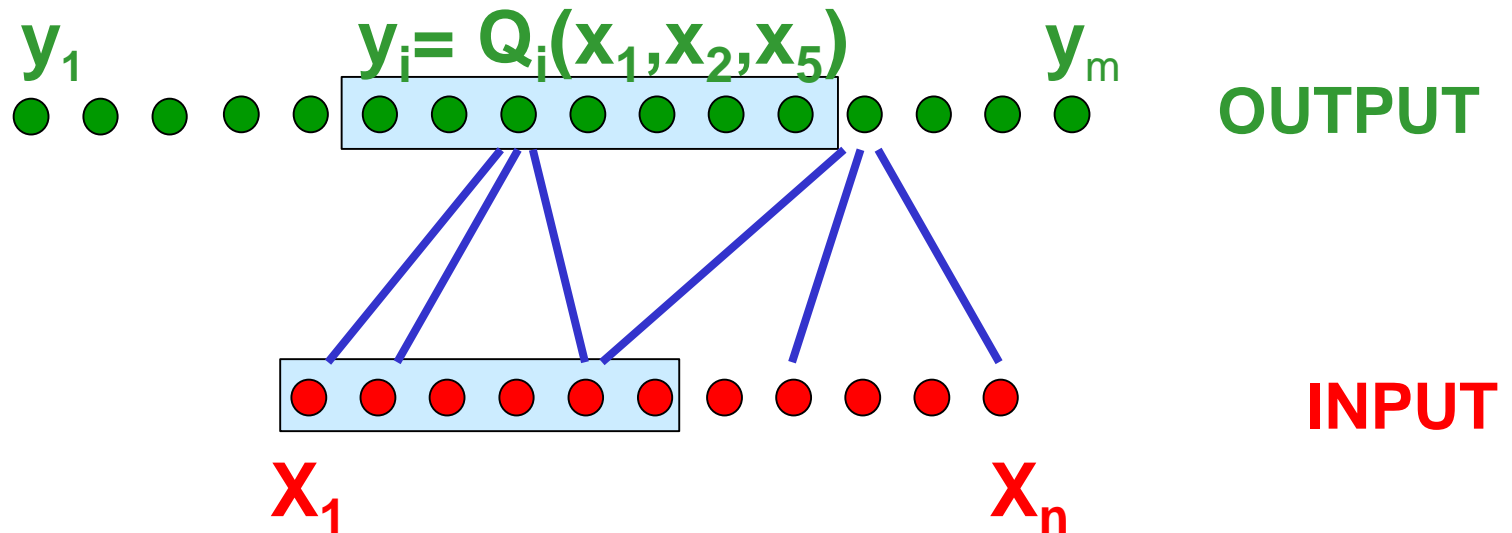
- Find “small” shrinking set of size k
- Enumerate over projected seed



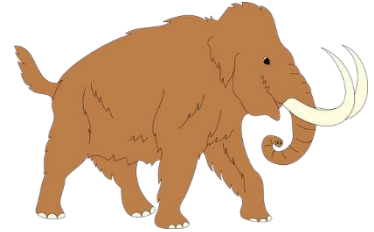
Lin-PRGs in NC^0

Expansion is necessary!

- Plausible to achieve $\exp(n)$ security

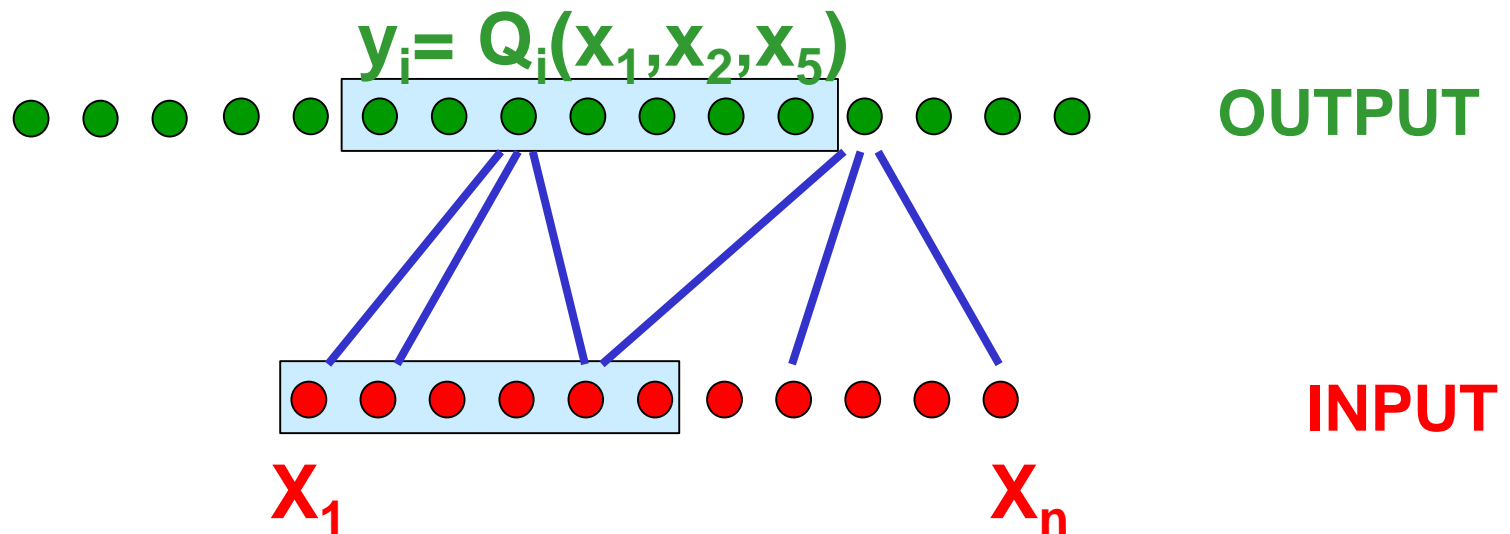


Poly-Stretch PRG in NC^0



Polynomial-Stretch: $m = n^2$

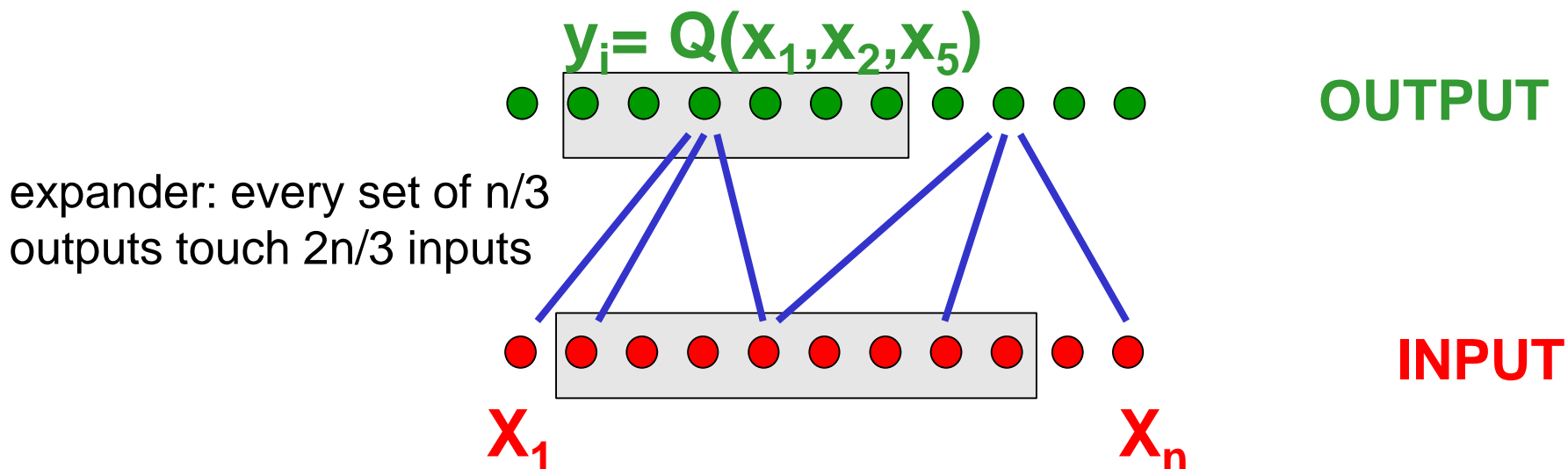
- Can only get $n^{1-\delta}$ expansion \Rightarrow sub-exp security
- Morally should get from sparse-LPN w/ sub-const noise [ABW10]
- All known constructions rely on var's of Goldreich's Assumption



Goldreich's Assumption [ECCC '00]

Conjecture: for random predicate Q , and \forall expander G , $m=n$ inversion takes $\exp(\Omega(n))$ -time

- First candidate for **optimal one-way function**
- Random local function is whp exp-hard to invert
- Constraint Satisfaction Problems are cryptographically-hard



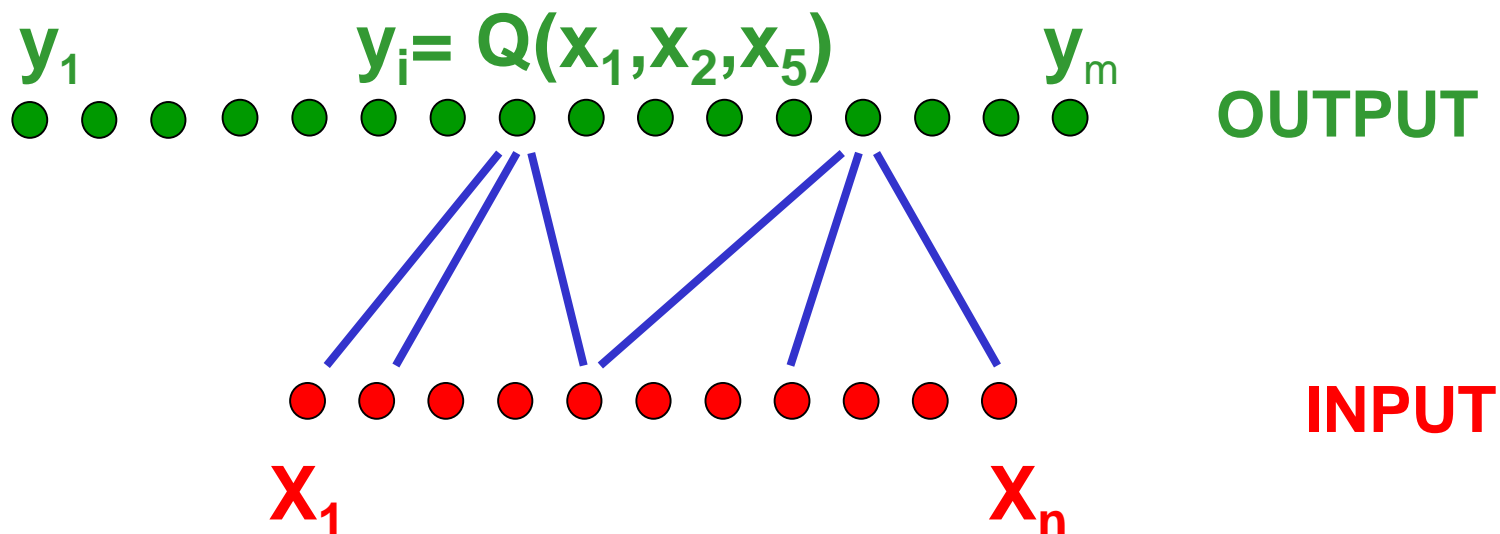
Generalization to Long Output

OW-Conjecture: for properly chosen predicate Q , any graph G inversion complexity is exponential in the expansion of G

Params: output length m , predicate Q , locality d , expansion quality

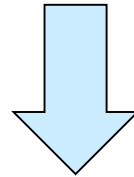
- Larger $m \Rightarrow$ easier to attack \Rightarrow security requires more “robust” predicates
- Weaker variant: for random graphs no poly-time inversion
- Strong variant confirmed for many classes of attacks

[CEMT09,ABW10,A12,ABR12,BR11,BQ12,OW14,FPV15,AL16, KMOW16] See survey [A15]



Generalization to Long Output

OW-Conjecture: for **properly chosen** predicate Q , any graph G inversion complexity is exponential in the **expansion of G**

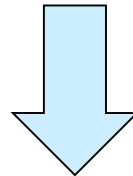


[A12,AR16]

weak

PRG-Conject: for **properly chosen** predicate Q , any graph G distinguishing complexity is exp. in **expansion of G**

1/poly-advantage



[AK19]

Poly-stretch local PRG

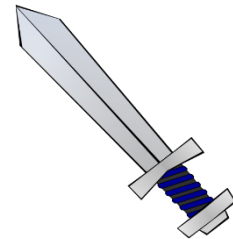
Generalization to Long Output

PRG-Conject: for properly chosen predicate Q , any graph G
distinguishing complexity is exp. in **expansion of G**

Which predicates yield PRGs?



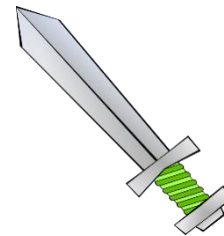
Resiliency



"Local" attacks



"Degree"

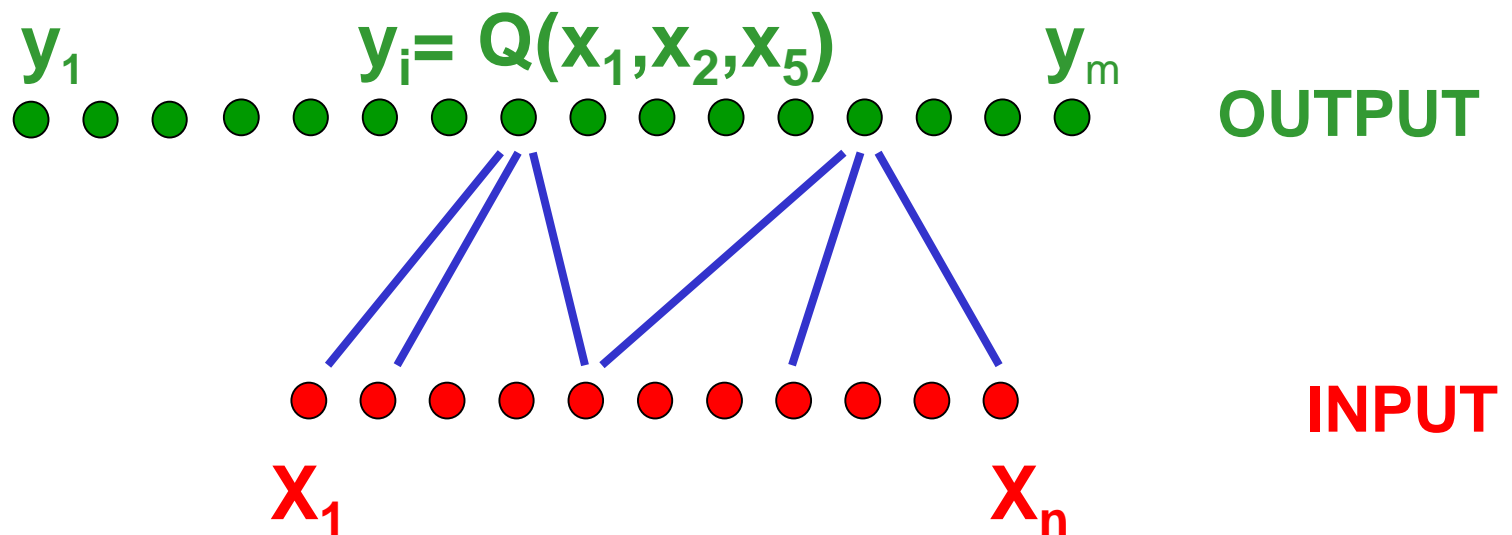


Linear algebra

Goal: Hard to distinguish y from random

More fragile than one-wayness:

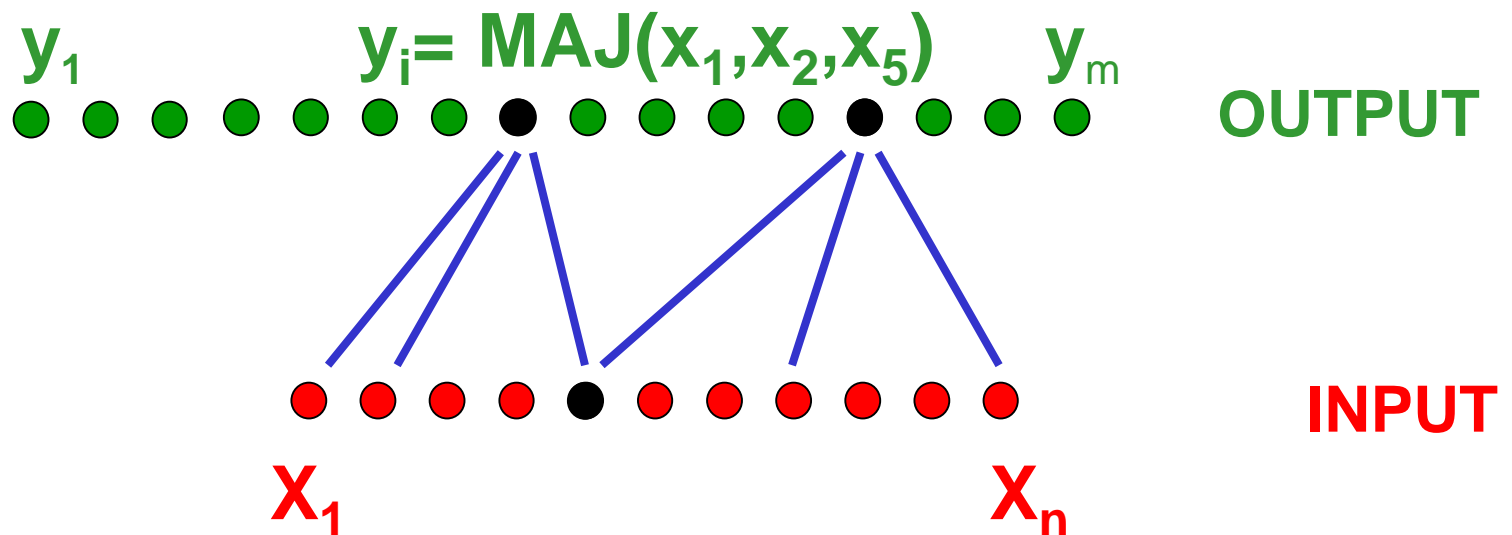
Predicate must be **balanced**



Goal: Hard to distinguish y from random

More fragile than one-wayness:

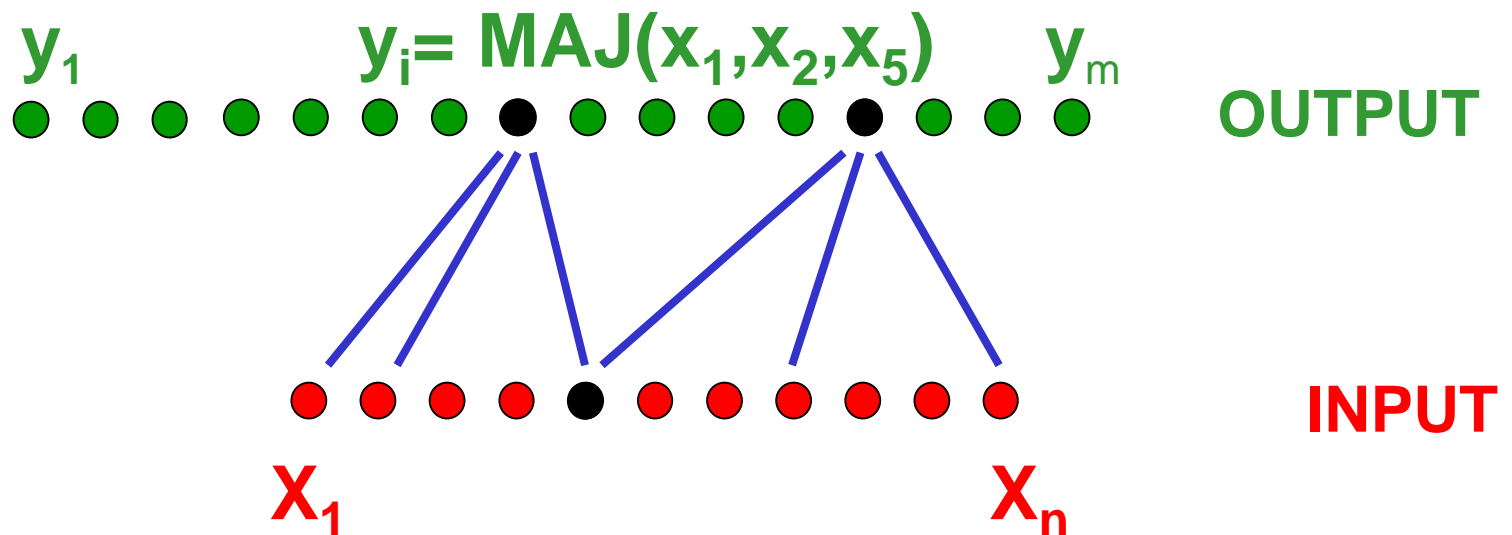
Predicate must be **balanced** even after fixing single input



Goal: Hard to distinguish y from random

k -resiliency [Cho-Gol-Has-Fre-Rud-Smo]:

Predicate must be **balanced** even after fixing k inputs

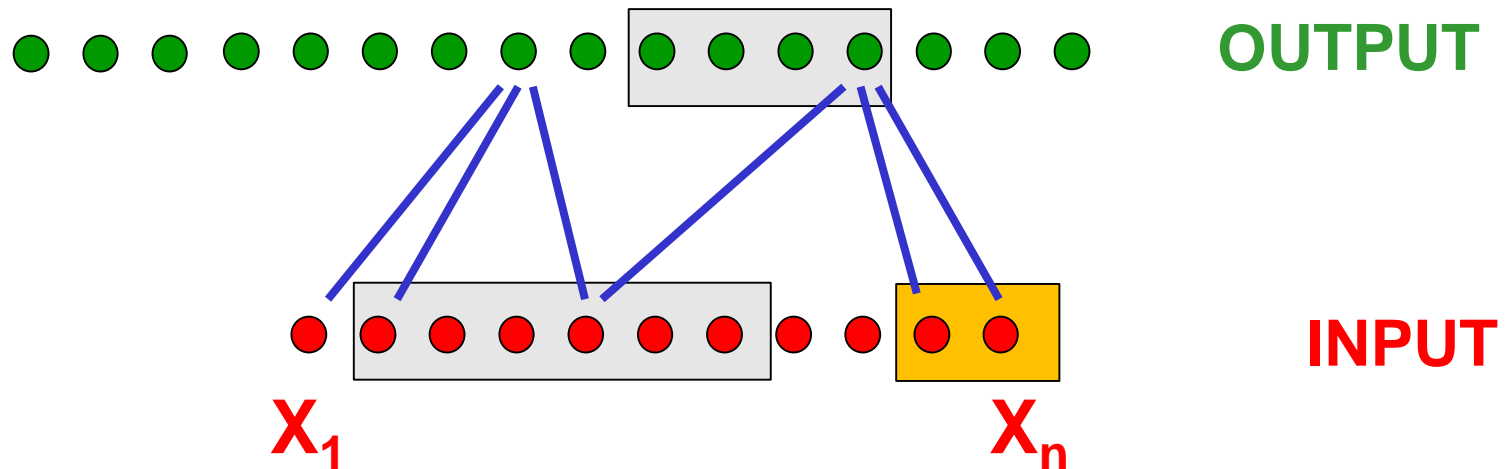


Resiliency defeats local attacks

[Mossel-Shpilka-Trevisan'03]

For $m=n^s$ resiliency of $k=2s-1$ is necessary and sufficient against

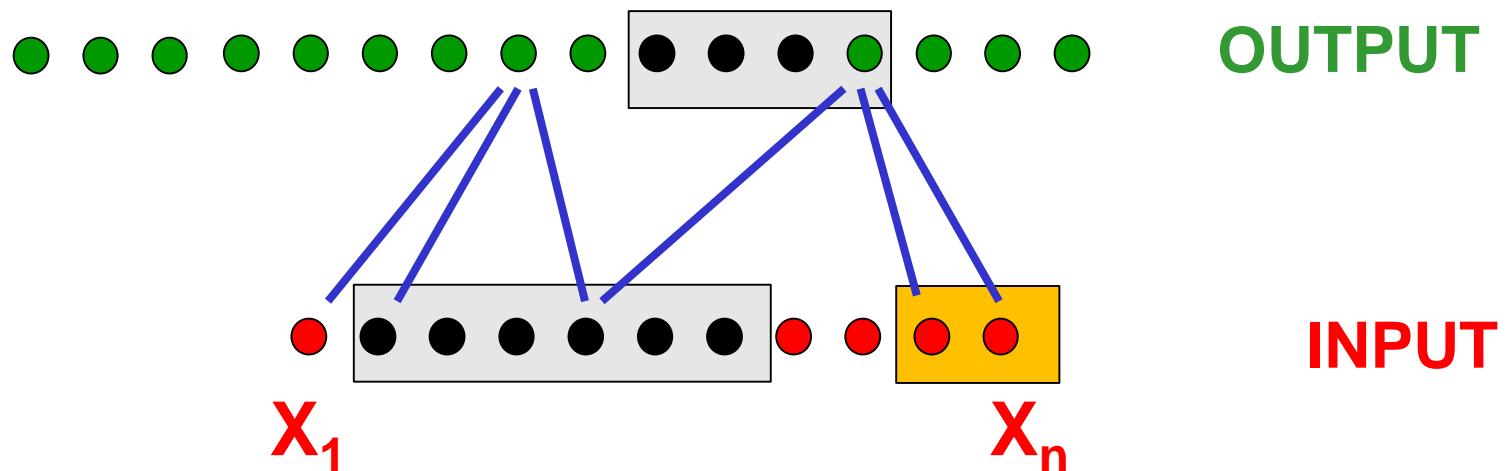
- Sub-exponential AC0 circuits [A-Bogdanov-Rosen12]
- Semidefinite programs [O'Donnell Witmer14]
- Sum of Squares attacks [Kothari Mori O'Donnell Witmer17]
- Statistical algorithms [Feldman Perkins Vempala15]



Resiliency defeats local attacks

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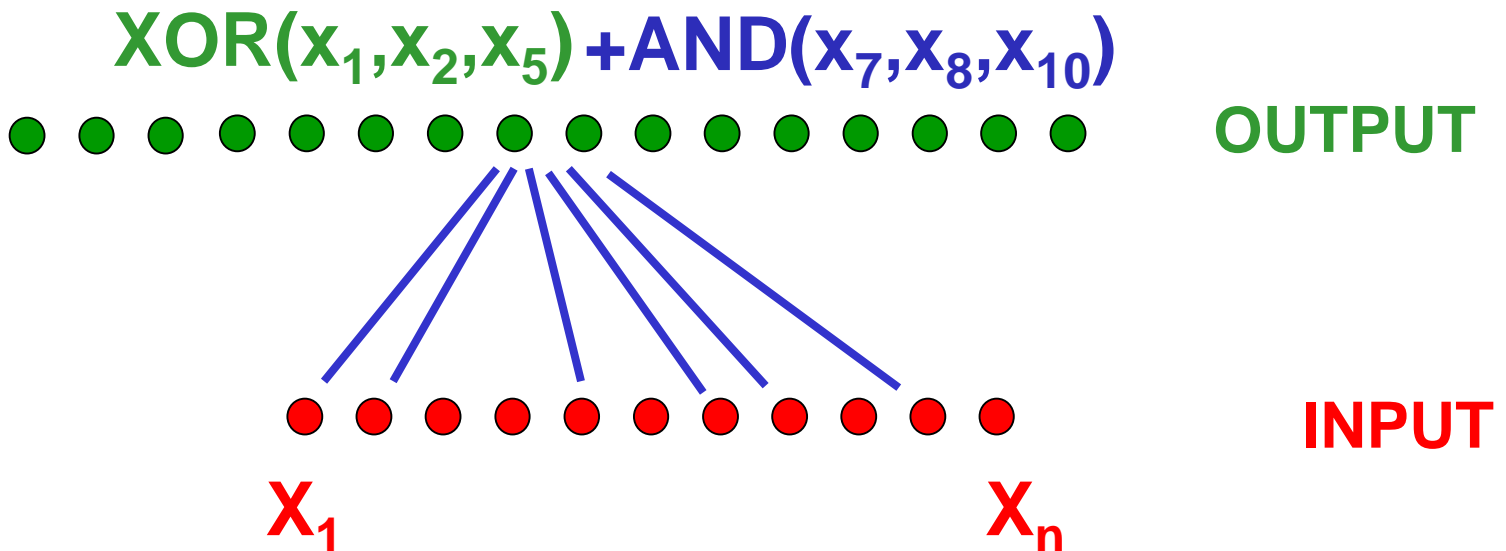


Defeating Linear Algebra

For $m=n^s$ need **algebraic degree** of s

Resiliency+Degree \Rightarrow Pseudorandomness? [OW14, A14, FPV15]

- **Yes** for $m < n^{5/4}$ and linear distinguishers [MST03, ABW10, ABR12]
i.e., small-bias generator [NN]
- **No** for larger m 's [A-Lovett16]

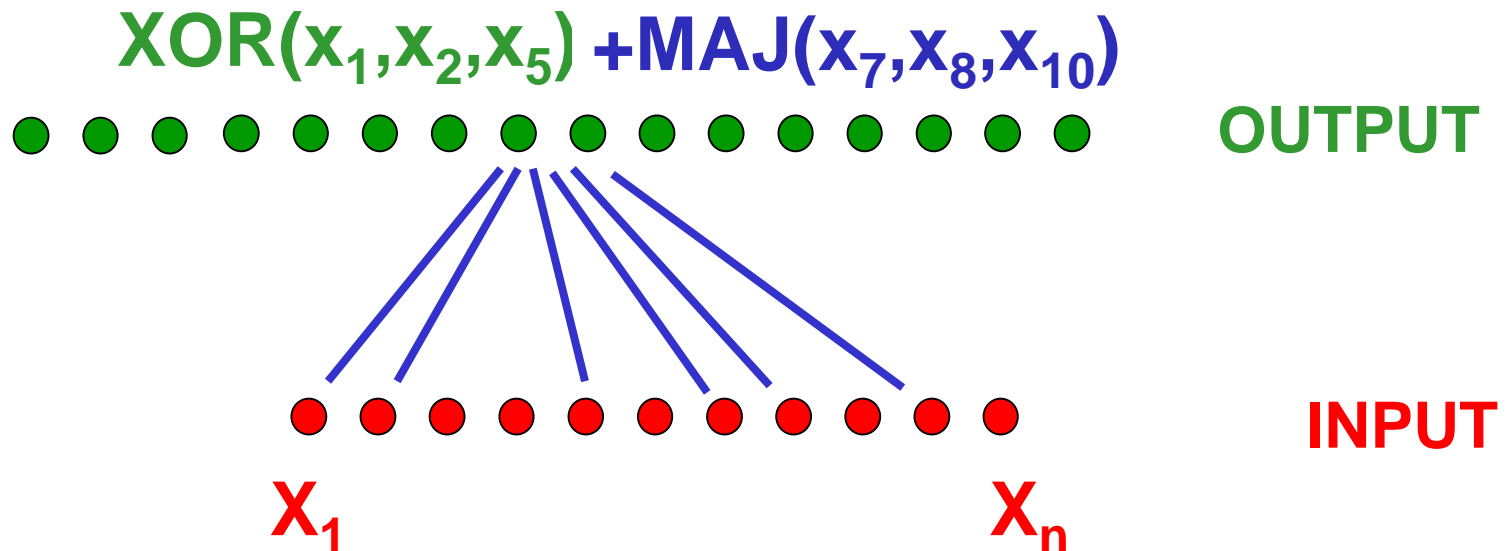


Defeating Linear Algebra [A-Lovett16]

b-fixing degree: algebraic degree of b even after fixing b inputs

Thm: For $m=n^s$, $\Theta(s)$ -bit fixing degree
necessary & sufficient against linear distinguishers

A stronger form of **rational-degree** is necessary & sufficient for defeating “algebraic attacks”



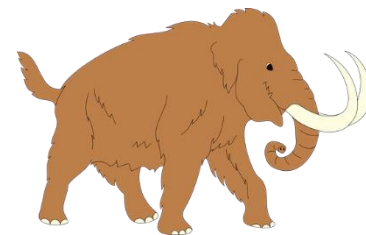
Summary: Local PPRGs

Seem to achieve sub-exp security

- For proper predicate best attack is exponential in expansion
- Concrete security should be further studied, see [CDMRR18]

Interesting TCS applications

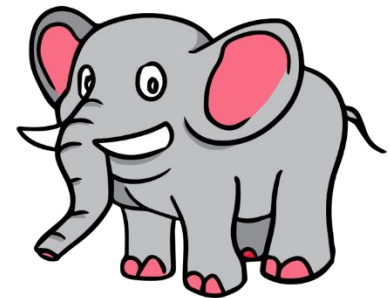
- CSPs are hard to approximate [Feige02, Ale03, AIK07,...,A17]
- Densest-subgraph is hard to approximate [A12]
- Hardness of learning depth-3 AC0 [AR16]



Symmetric eXternal DH [BGdMM05]

$$e: \mathbb{G}_1 \times \mathbb{G}_2 \rightarrow \mathbb{G}_T$$

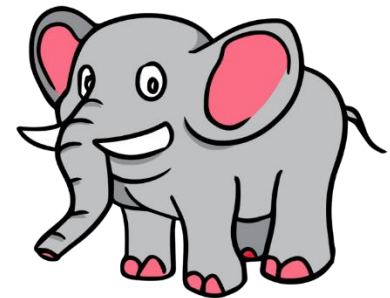
- **SXDH:** DDH is hard in both \mathbb{G}_1 and \mathbb{G}_2
 - $(g^a, g^b, g^{ab}) \approx (g^a, g^b, g^c)$ for $a, b, c \leftarrow \mathbb{Z}_p$
 - where g generates \mathbb{G}_1 or \mathbb{G}_2



Symmetric eXternal DH [BGdMM05]

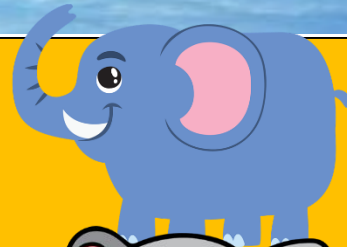
$$e: \mathbb{G}_1 \times \mathbb{G}_2 \rightarrow \mathbb{G}_T$$

- **SXDH:** DDH is hard in both \mathbb{G}_1 and \mathbb{G}_2
- Strong form of DDH
 - Can be broken by Quantum adversary
- Standard bilinear assumption
- Groups defined over elliptic curves
- Decisional
- Cryptanalysis by math community?

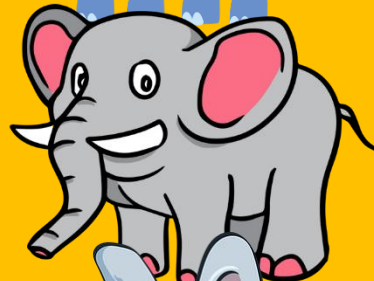




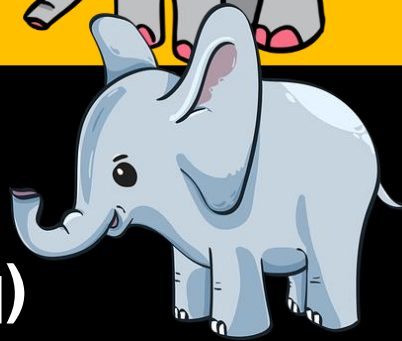
Cryptomania



LWE



SXDH

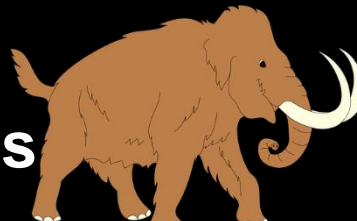


**LPN
(mod-q)**

**Complexity
of
Crypto**

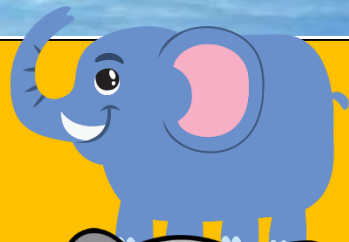
Minicrypt

Local PRGs

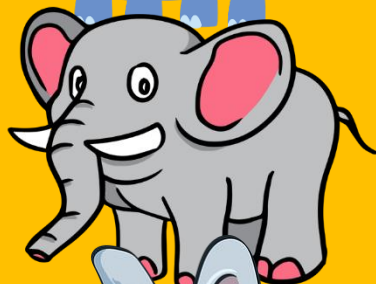




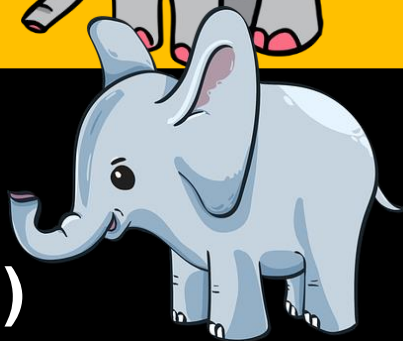
Order?



LWE

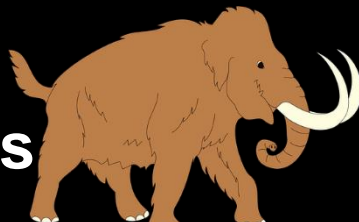


SXDH



**LPN
(mod-q)**

Local PRGs



**Thank
You!**