

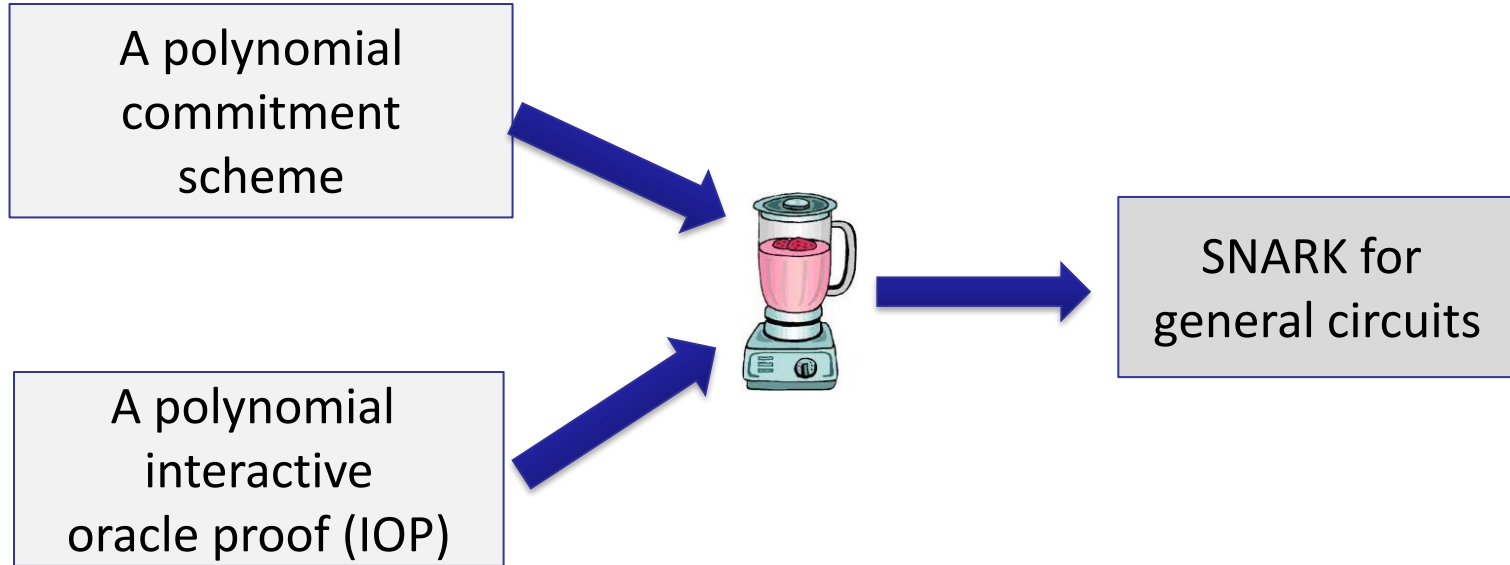
# Zero Knowledge Proofs

## Polynomial Commitments based on error-correcting codes

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# Recall: common paradigm for efficient SNARK



# Last time: KZG polynomial commitment

Univariate polynomials of degree  $\leq d$

Prover

$$gp = (g, g^\tau, g^{\tau^2}, \dots, g^{\tau^d})$$

Verifier

$$f(x)$$

$$com_f = g^{f(\tau)}$$

$$com_f$$

$$u$$

$$\begin{aligned} f(x) - f(u) \\ = (x - u)q(x) \end{aligned}$$

$$v, \text{ proof } \pi = g^{q(\tau)}$$

$$\begin{aligned} e(com_f / g^v, g) \\ = e(g^{\tau-u}, \pi) \end{aligned}$$

# Last time: other PC based on discrete-log

Scheme	Prover	Proof size	Verifier	Trusted Setup	Crypto primitive
Bullet-proofs	$O_\lambda(d)$	$O_\lambda(\log d)$	$O_\lambda(d)$	✗	discrete-log
Hyrax	$O_\lambda(d)$	$O_\lambda(\sqrt{d})$	$O_\lambda(\sqrt{d})$	✗	discrete-log
Dory	$O_\lambda(d)$	$O_\lambda(\log d)$	$O_\lambda(\log d)$	✗	pairing
Dark	$O_\lambda(d)$	$O_\lambda(\log d)$	$O_\lambda(\log d)$	✗	unknown order group

# Poly-commit based on error-correcting codes

## Motivations:

- ✓ Plausibly post-quantum secure
- ✓ No group exponentiations (prover only uses hashes, additions and multiplications)
- ✓ Small global parameters

## Drawbacks:

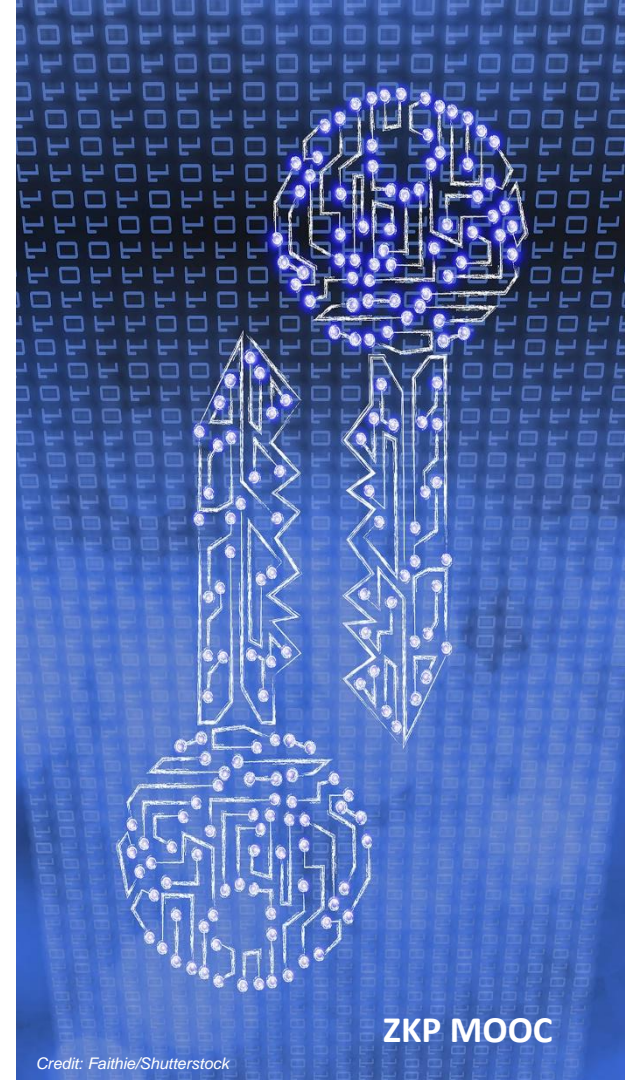
- ✗ Large proof size
- ✗ Not homomorphic and hard to aggregate

# Plan of this lecture

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- Background on error-correcting codes
- Polynomial commitment based on error-correcting codes
- Linear-time encodable code based on expanders

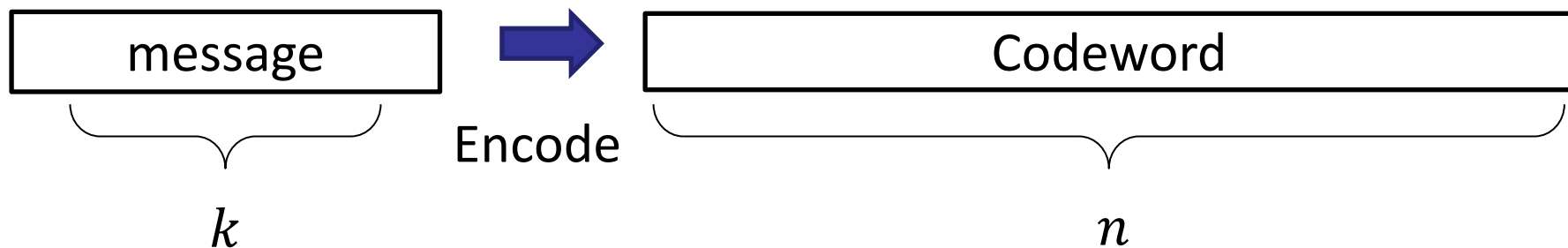
# Background



# Error-correcting code

$[n, k, \Delta]$  code:

- $\text{Enc}(m)$ : Encode a message of size  $k$  to a codeword of size  $n$
- Minimum distance (Hamming) between any two codewords is  $\Delta$





# Example: repetition code

Binary with  $k = 2$  and  $n = 6$

- $\text{Enc}(00) = 000000$ ,  $\text{Enc}(01) = 000111$
- $\text{Enc}(10) = 111000$ ,  $\text{Enc}(11) = 111111$
- Minimum distance  $\Delta = 3$

Can correct 1 error during the transmission

e.g.  $0\mathbf{1}0111 \rightarrow 01$      $\text{Dec}(c)$ : decode algorithm (not used in poly-commit)

# Rate and relative distance

Rate:  $\frac{k}{n}$

Relative distance:  $\frac{\Delta}{n}$

E.g. repetition code with rate  $\frac{1}{a}$ ,  $\Delta = a$ , relative distance:  $\frac{1}{k}$

Trade-off between the rate and the distance of a code

# Linear code

Any linear combination of codewords is also a codeword

⇒ Encoding can always be represented as vector-matrix multiplication between  $m$  and the generator matrix

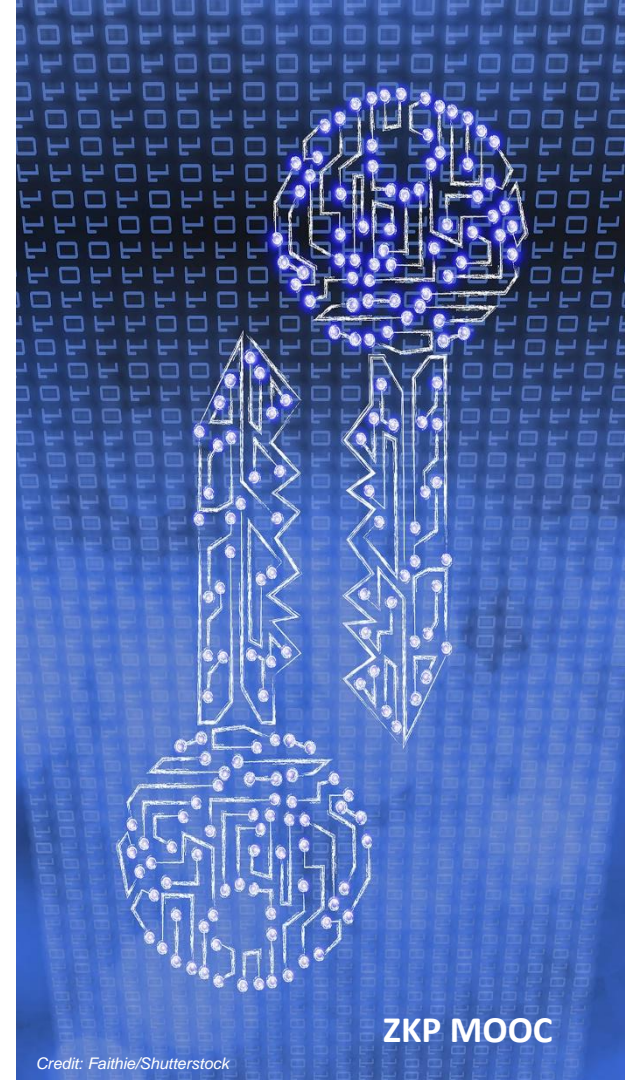
⇒ minimum distance is the same as the codeword with the least number of non-zeros (weight).

# Example: Reed-Solomon Code

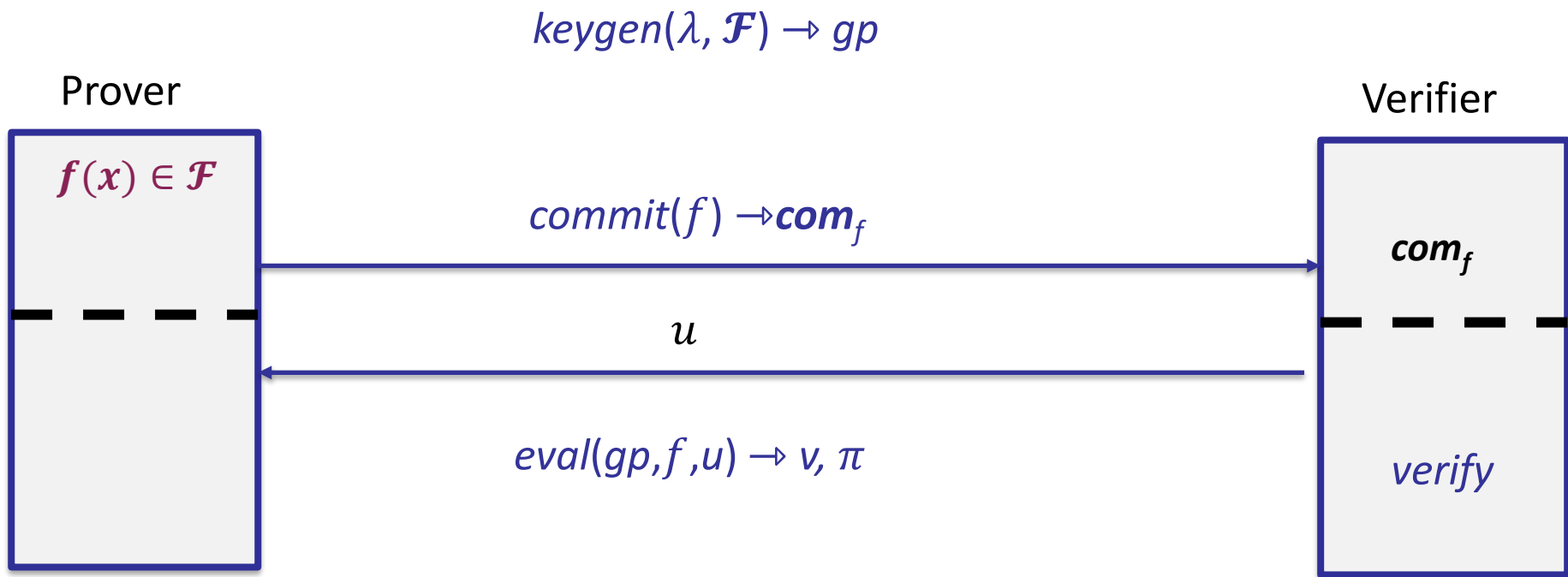
Encode:  $\mathbb{F}_p^k \rightarrow \mathbb{F}_p^n$

- View the message as a unique degree  $k-1$  **univariate polynomial**
- The codeword is the **evaluations** at  $n$  points  
E.g.,  $(\omega, \omega^2, \dots, \omega^n)$  for  $n$ -th root-of-unity  $\omega^n = 1 \pmod p$
- Distance  $\Delta = n - k + 1$   
a degree  $k-1$  polynomial has **at most  $k-1$  roots**  
E.g,  $n = 2k$ , rate is  **$1/2$** , and relative distance is  **$1/2$**
- Encoding time:  **$O(n \log n)$**  using the fast Fourier transform (**FFT**)

# Polynomial commitment based on linear codes



# Recall: polynomial commitment



# Polynomial coefficients in a matrix

$$f(u) = \sum_{i=1}^{\sqrt{d}} \sum_{j=1}^{\sqrt{d}} f_{i,j} u^{i-1+(j-1)\sqrt{d}}$$

The diagram illustrates the matrix of coefficients  $f_{i,j}$  used in the polynomial expansion. A large blue brace on the left side of the matrix is labeled  $\sqrt{d}$ , indicating the number of rows. The matrix itself is a  $\sqrt{d} \times \sqrt{d}$  grid of elements. The elements are arranged as follows: the first row contains  $f_{1,1}$ ,  $f_{1,2}$ , an ellipsis, and  $f_{1,\sqrt{d}}$ ; the second row contains  $f_{2,1}$ ,  $f_{2,2}$ , an ellipsis, and  $f_{2,\sqrt{d}}$ ; a vertical ellipsis indicates intermediate rows; the final row contains  $f_{\sqrt{d},1}$ ,  $f_{\sqrt{d},2}$ , an ellipsis, and  $f_{\sqrt{d},\sqrt{d}}$ . A blue brace is positioned below the matrix, spanning its width.

# Polynomial evaluation

$$f(u) = \left[ 1, u, u^2, \dots, u^{\sqrt{d}-1} \right] \times \begin{pmatrix} f_{1,1} & f_{1,2} & \dots & f_{1,\sqrt{d}} \\ f_{2,1} & f_{2,2} & \dots & f_{2,\sqrt{d}} \\ \vdots & \vdots & \ddots & \vdots \\ f_{\sqrt{d},1} & f_{\sqrt{d},2} & \dots & f_{\sqrt{d},\sqrt{d}} \end{pmatrix} \times \begin{bmatrix} 1 \\ u^{\sqrt{d}} \\ u^{2\sqrt{d}} \\ \dots \\ u^{d-\sqrt{d}} \end{bmatrix}$$

$$f(u) = \sum_{i=1}^{\sqrt{d}} \sum_{j=1}^{\sqrt{d}} f_{i,j} u^{i-1+(j-1)\sqrt{d}}$$



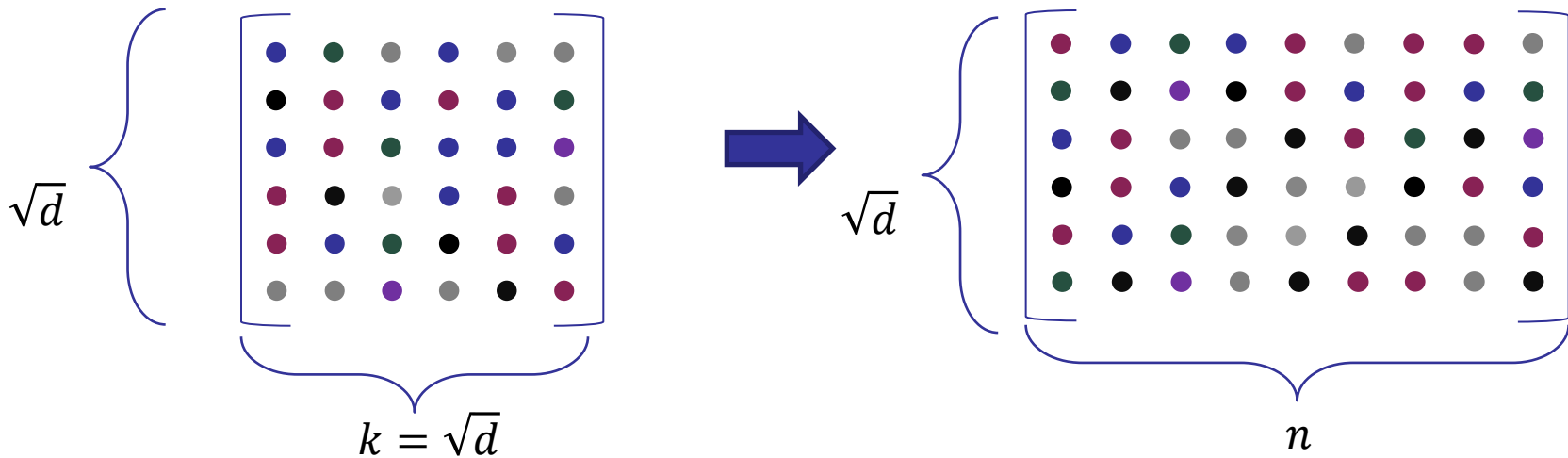
# Reducing to Vec-Mat product

$$\left[1, u, u^2, \dots, u^{\sqrt{d}-1}\right] \times \begin{pmatrix} f_{1,1} & f_{1,2} & \dots & f_{1,\sqrt{d}} \\ f_{2,1} & f_{2,2} & \dots & f_{2,\sqrt{d}} \\ \vdots & \vdots & \ddots & \vdots \\ f_{\sqrt{d},1} & f_{\sqrt{d},2} & \dots & f_{\sqrt{d},\sqrt{d}} \end{pmatrix} = \underbrace{[\quad]}_{\sqrt{d}}$$

Argument for Vec-Mat product

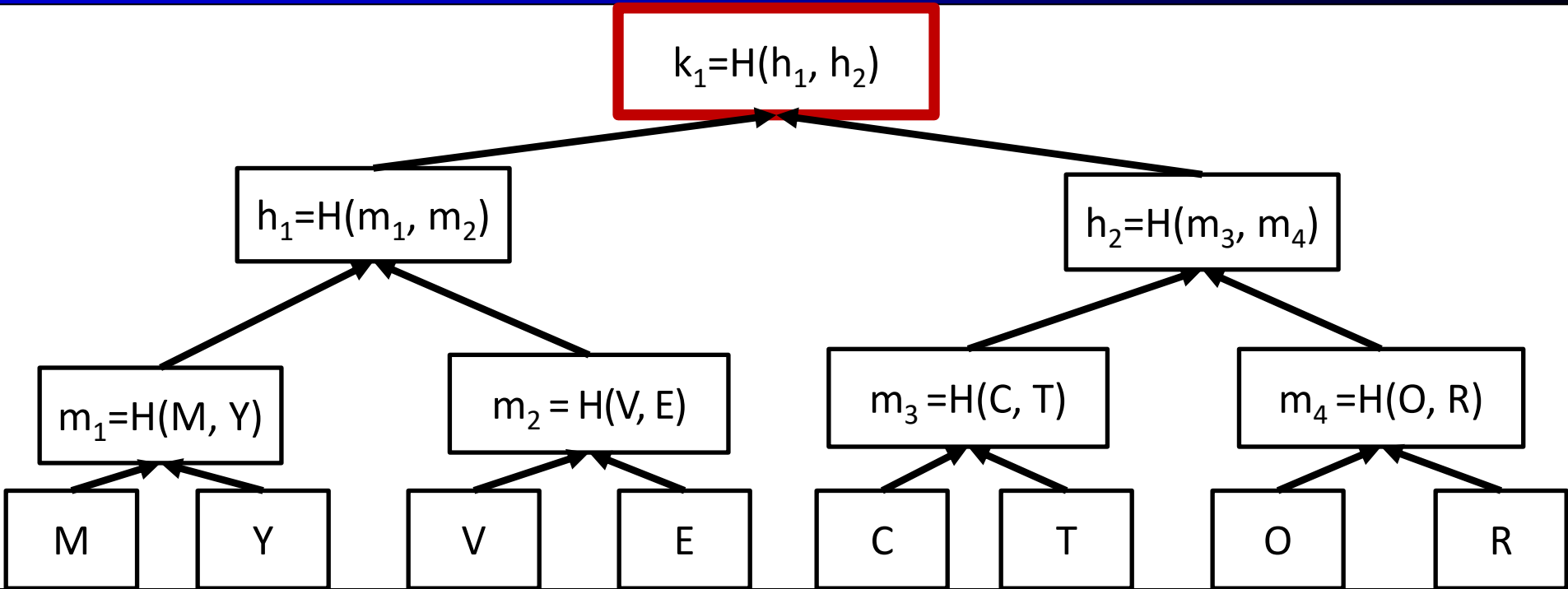
→ Polynomial commitment with  $\sqrt{d}$  proof size

# Encoding the polynomial

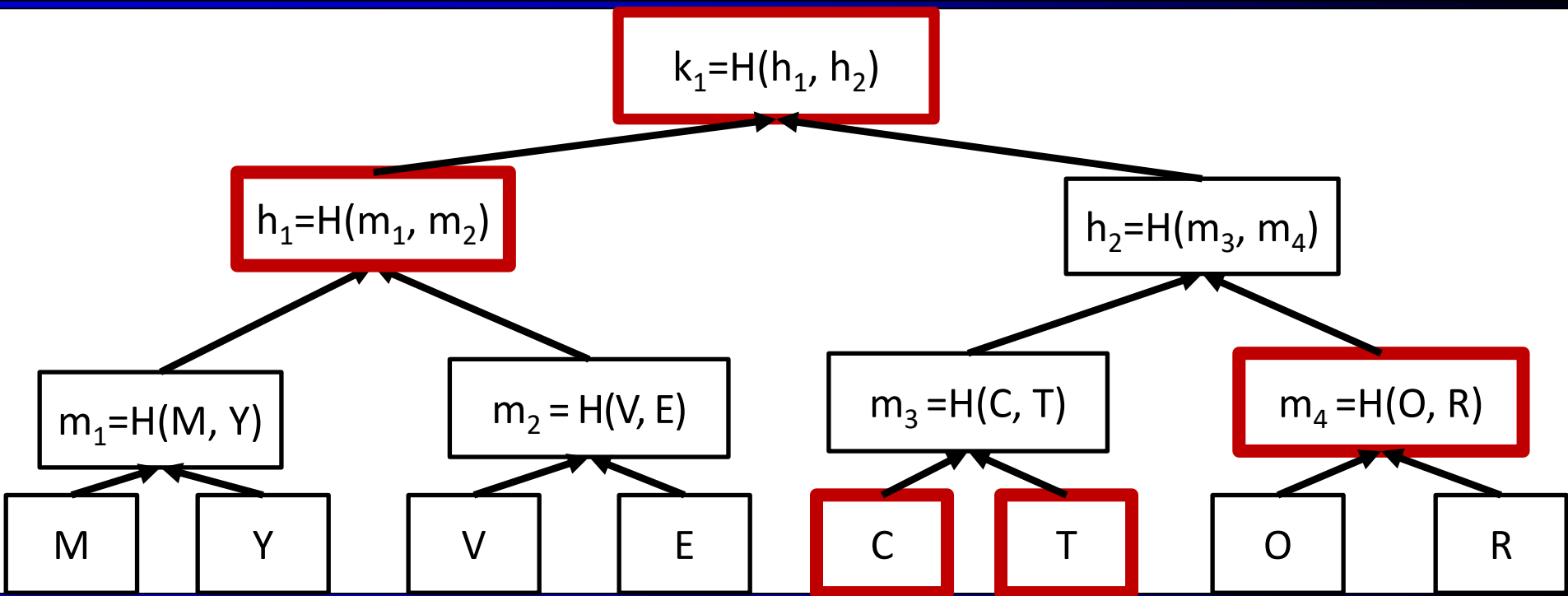


Encode each row with a linear code

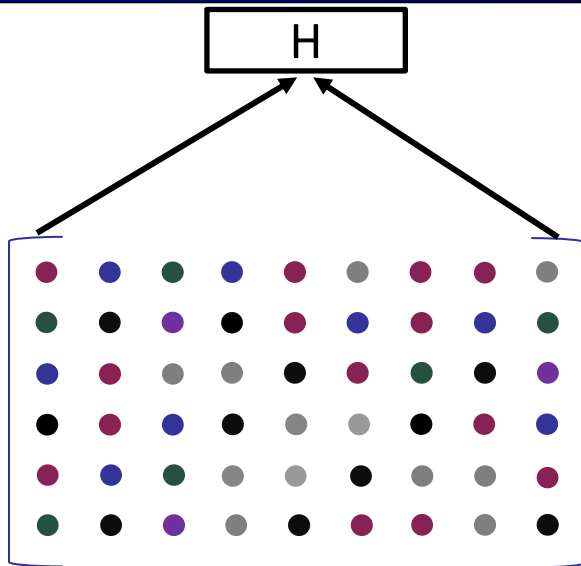
# Recall: Merkle tree commitment



# Recall: Merkle tree opening



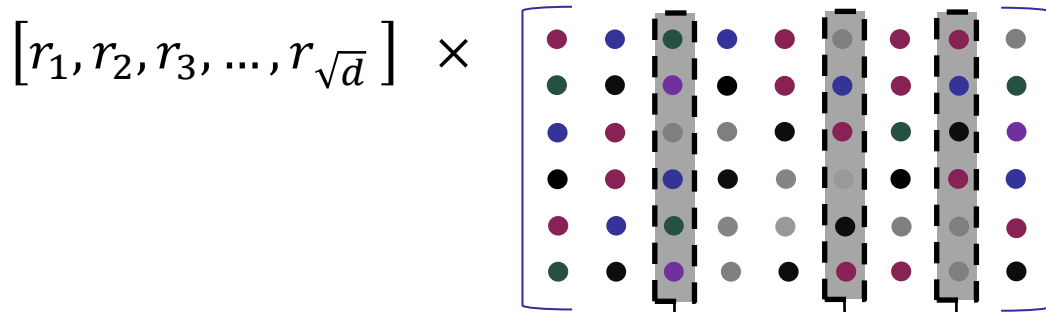
# Committing the polynomial



Commit to each column of the encoded matrix using Merkle tree

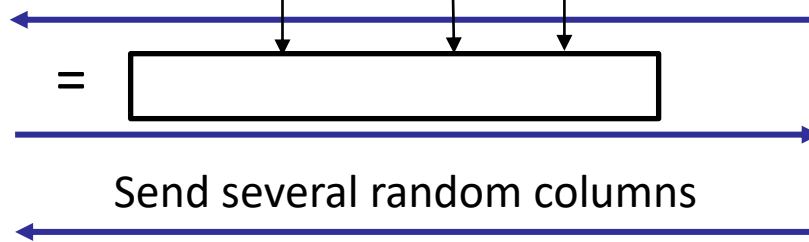
# Step 1: Proximity test

Test if the committed matrix indeed consists of  $\sqrt{d}$  codewords

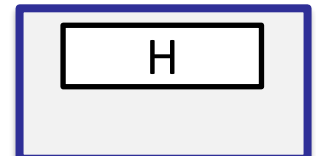


1. The vector is a **codeword**
2. Columns are as committed in **Merkle tree**
3. **Inner product** between  $r$  and each column is consistent

Prover

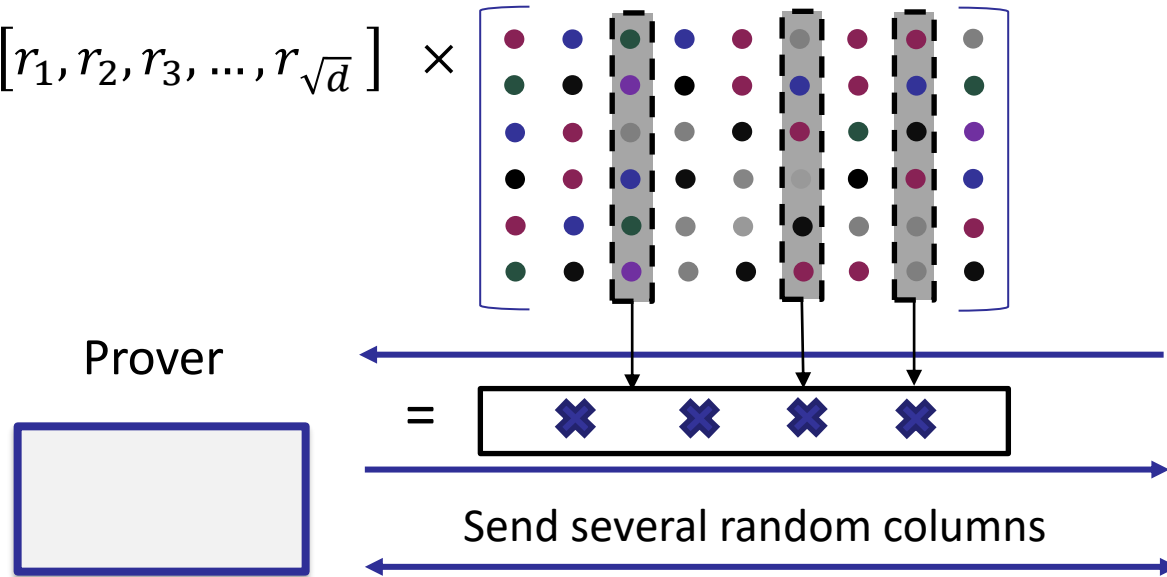


Verifier



# Soundness (Intuition)

$$[r_1, r_2, r_3, \dots, r_{\sqrt{d}}]$$



Suppose the prover cheats

- If the vector is correctly computed  $\rightarrow$  it is not a codeword  $\rightarrow$  ~~check 1~~
- If the vector is false  $\rightarrow$  many different locations from the correct answer
  - By check 2, columns are as committed
  - Probability of passing check 3 is small

# Ligero [AHIV'2017] and [BCGGHJ'2017]

- Ligero [AHIV'2017] : Interleaved test. Reed-Solomon code
- [BCGGHJ'2017] : Ideal linear commitment model. Linear-time encodable code → first SNARK with linear prover time



# In the formal proof [AHIV'2017]

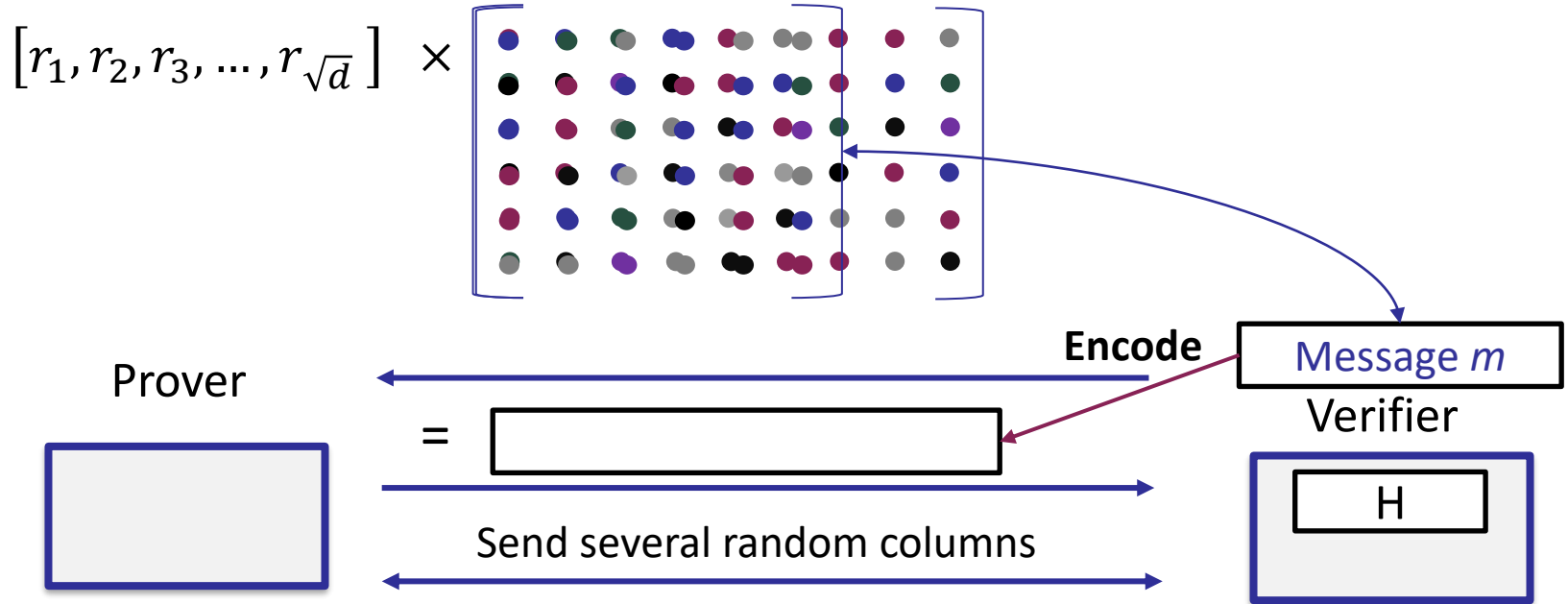
If the committed matrix  $C$  is  $e$ -far from any codeword  
for  $e < \frac{\Delta}{4}$

$\rightarrow \Pr[w = r^T C \text{ is } e\text{-close to any codeword}] \leq \frac{e+1}{\mathbb{F}}$

If  $w = r^T C$  is  $e$ -far from any codeword

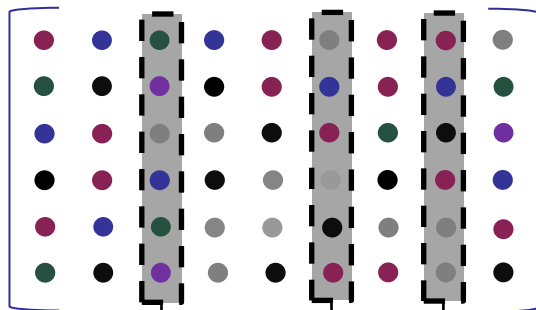
$\rightarrow \Pr[\text{check 3 is true for } t \text{ random columns}] \leq \left(1 - \frac{e}{n}\right)^t$

# One optimization



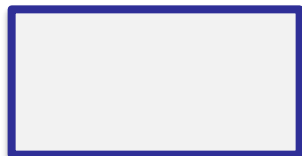
# Step 2: Consistency check

$$\left[1, u, u^2, \dots, u^{\sqrt{d}-1}\right] \times$$



- ~~1. The vector is a codeword~~
- ~~2. Columns are as committed in Merkle tree~~
3. Inner product between  $\vec{u}$  and each column is consistent

Prover



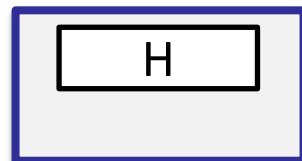
=



Encode



Verifier



Send several random columns

# Soundness (intuition)

- By the proximity test, the committed matrix  $C$  is close to a codeword
- There exists an extractor that extracts  $F$  by Merkle tree commitment and decoding  $C$ , s.t.  $\vec{u} \times F = m$  with probability  $1 - \epsilon$

# Poly-commit based on linear code

- Keygen: sample a hash function
- Commit: **encode** the coefficient matrix of  $f$  row-wise with a linear code, compute the **Merkle tree commitment**
- Eval and Verify:
  - **Proximity test**: random linear combination of all rows, check its consistency with  $t$  random columns
  - **Consistency test**:  $\vec{u} \times F = m$ , encode  $m$  and check its consistency with  $t$  random columns
  - $f(u) = \langle m, \vec{u}' \rangle$

# Properties of the polynomial commitment

- Keygen:  $O(1)$ , transparent setup!
- Commit:
  - Encoding:  $O(d \log d)$  field multiplications using RS code,  $O(d)$  using linear-time encodable code
  - Merkle tree:  $O(d)$  hashes,  $O(1)$  commitment size
- Eval:  $O(d)$  field multiplications  
(non-interactive via Fiat Shamir)
- Proof size:  $O(\sqrt{d})$
- Verifier time:  $O(\sqrt{d})$

# Performance the poly-commit [GLSTW'21]

degree  $d = 2^{25}$ , linear-time encodable code

- Commit: 36s
- Eval: 3.2s
- Proof size: 49MB
- Verifier time: 0.7s

# [Bootle-Chiesa-Groth'20] and Brakedown [GLSTW'21]

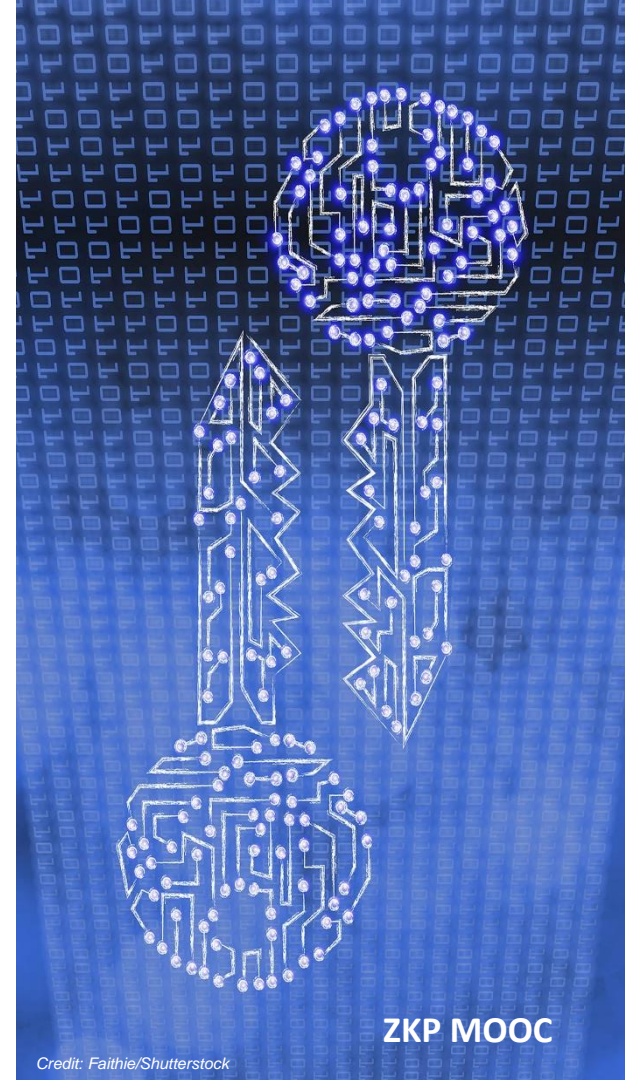
- [Bootle-Chiesa-Groth'20]: Tensor query IOP  $\langle f, (\vec{u} \otimes \vec{u}') \rangle$ 
  - Generalizes to multiple dimensions with proof size  $O(n^\epsilon)$  for constant  $\epsilon < 1$
- Brakedown [GLSTW'21]: polynomial commitment based on tensor query
  - Knowledge soundness without efficient decoding algorithm



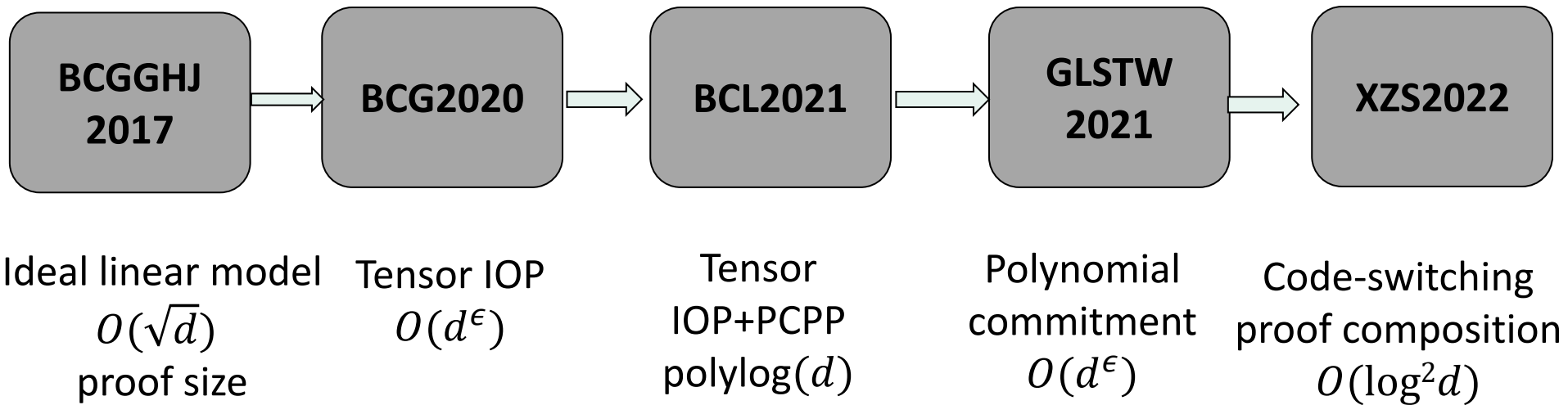
# [Bootle-Chiesa-Liu'21] and Orion [Xie-Zhang-Song'22]

- [Bootle-Chiesa-Liu'21]
  - Proof size  $\text{polylog}(n)$  with a proof composition of tensor IOP and PCP of proximity [Mie'09]
- Orion [Xie-Zhang-Song'22]
  - Proof size  $O(\log^2 n)$  with a proof composition of the code-switching technique [Ron-Zewi-Rothblum'20]  
(5.7MB for  $d = 2^{25}$ )

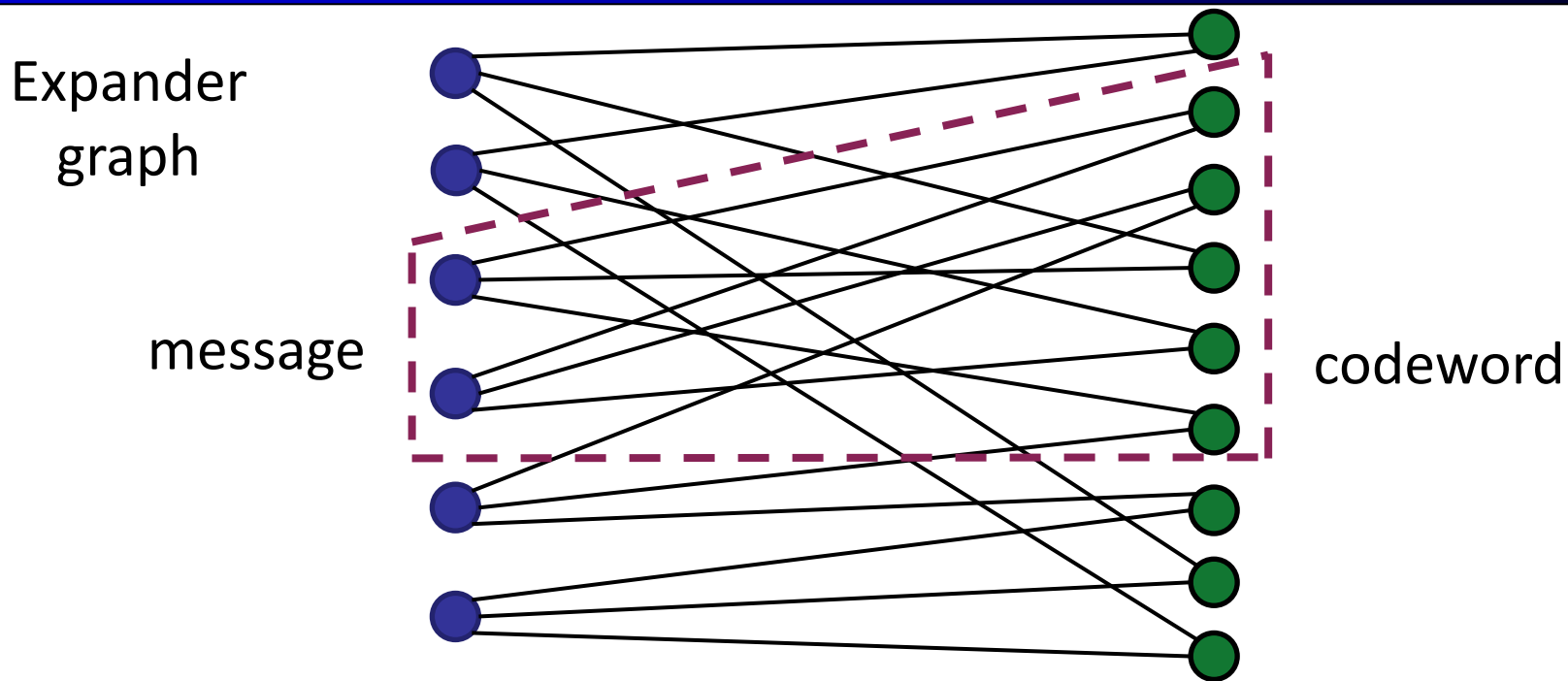
# Linear-time encodable code



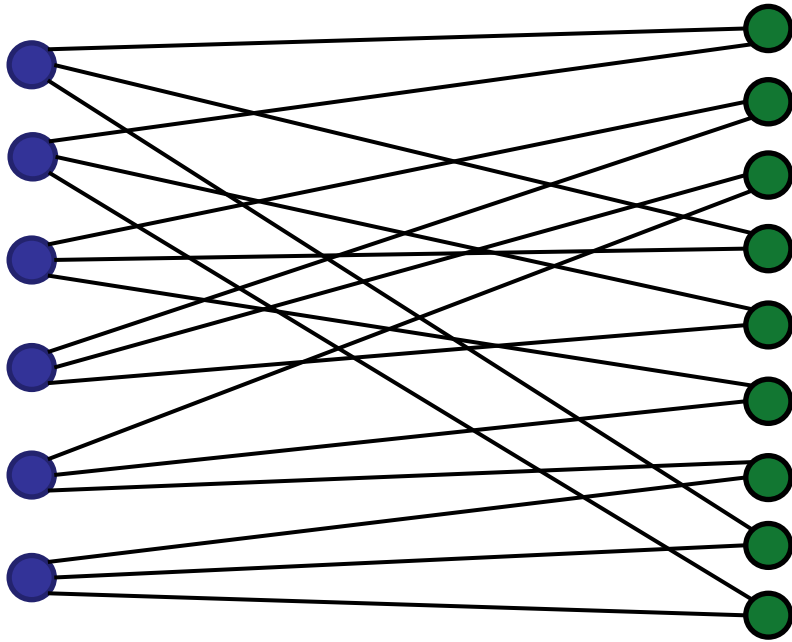
# SNARKs with linear prover time



# Linear-time encodable code [Spielman'96][Druk-Ishai'14]

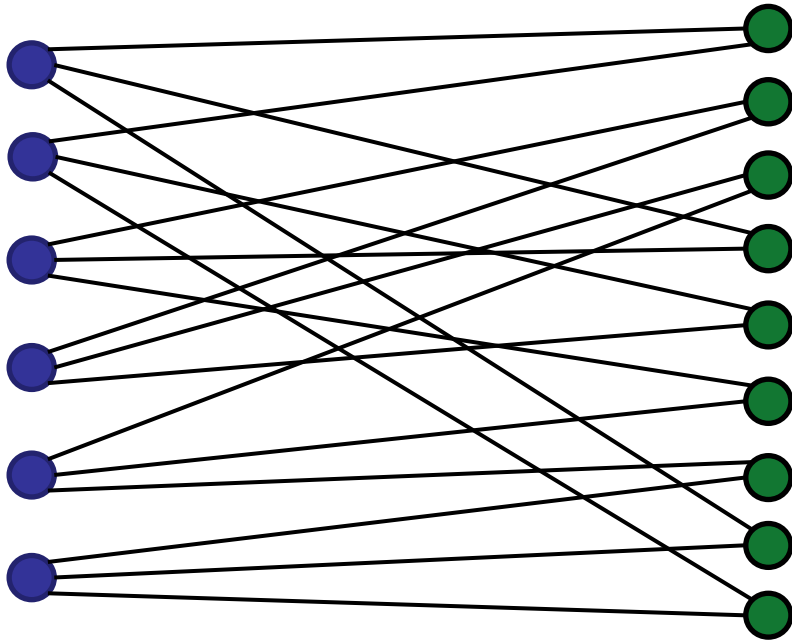


# Lossless Expander



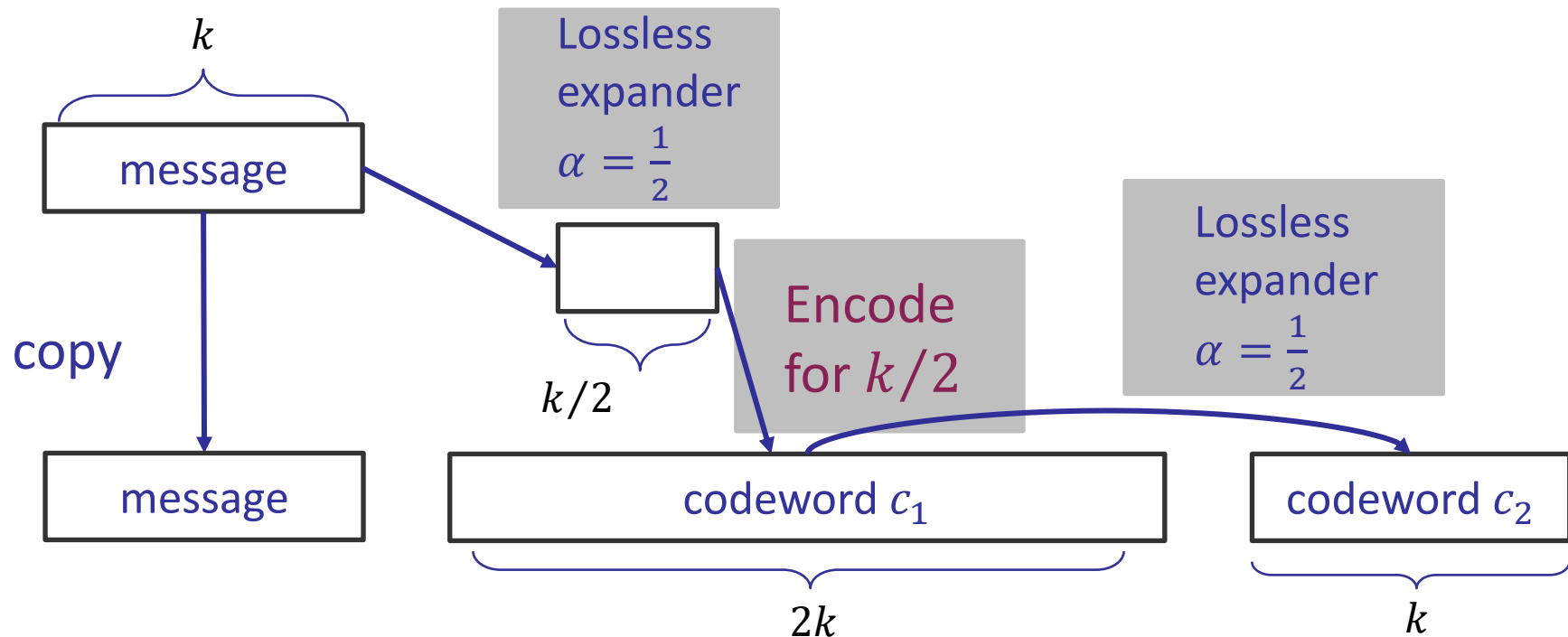
- # left nodes =  $|L|$ , # right nodes =  $\alpha|L|$  for a constant  $\alpha$
- Degree of a left node =  $g$
- For every subset  $S$  of nodes on the left, # of neighbors  $|\Gamma(S)| = g|S|$ ,  
for  $|S| \leq \frac{\alpha|L|}{g}$

# Lossless Expander



- # left nodes =  $|L|$ , # right nodes =  $\alpha|L|$  for a constant  $\alpha$
- Degree of a left node =  $g$
- For every subset  $S$  of nodes on the left, # of neighbors  
 $|\Gamma(S)| \geq (1 - \beta)g|S|$ , for  $|S| \leq \frac{\delta|L|}{g}$   
( $\beta \rightarrow 0, \delta \rightarrow \alpha$ )

# Overview of the recursive encoding



# Encoding algorithm

- Message  $m$  of size  $k$ , codeword size  $4k$ , rate is  $1/4$
  - Suppose there is an encoding algorithm from  $k/2$  to  $2k$  with good relative distance  $\Delta$
  - Suppose there are lossless expander graphs of size  $k$  and  $2k$ , and  $\alpha = 1/2$
1. Pass  $m$  through lossless expander to get  $m_1$  of size  $k/2$
  2. Encode  $m_1$  to get  $c_1$  of size  $2k$
  3. Pass  $c_1$  through lossless expander to get  $c_2$  of size  $k$
  4. Codeword  $c = m || c_1 || c_2$



# Recursive encoding

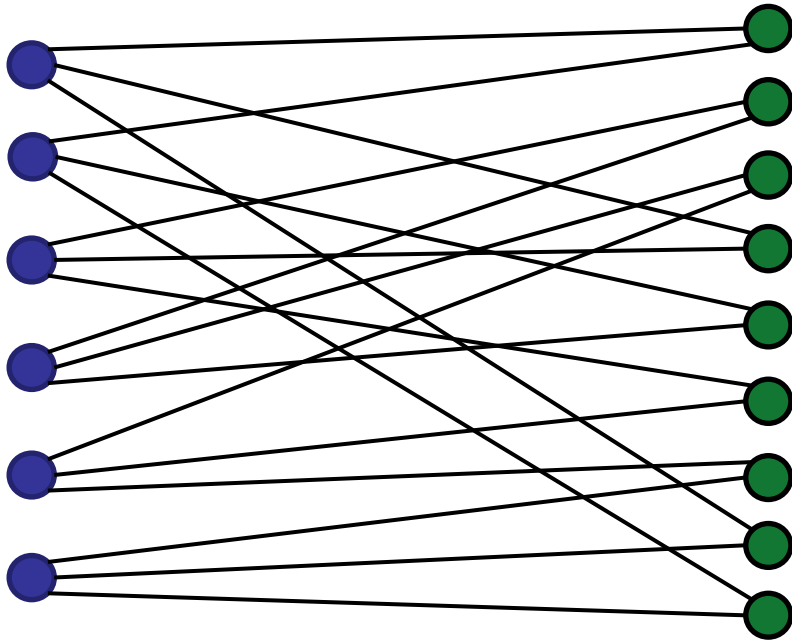
- Repeat for  $k/2, k/4 \dots$  until a constant size
- Use any code with good distance for a constant-size message. E.g., Reed-Solomon code

# Distance of the code

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constant relative distance  $\Delta' = \min\{\Delta, \frac{\delta}{4g}\}$

# Lossless Expander



- # left nodes =  $k$ , # right nodes =  $\alpha k$  for a constant  $\alpha$
- Degree of a left node =  $g$
- For every subset  $S$  of nodes on the left, # of neighbors  
 $|\Gamma(S)| \geq (1 - \beta)g|S|$ , for  $|S| \leq \frac{\delta|L|}{g}$   
( $\beta \rightarrow 0, \delta \rightarrow \alpha$ )

# Proof of constant relative distance [Druk-Ishai'14]

constant relative distance  $\Delta' = \min\{\Delta, \frac{\delta}{4g}\}$ , codeword  $c = m || c_1 || c_2$

1. If weight of  $m$  is larger than  $4k\Delta'$   $\rightarrow$  done
2. If (weight of  $m$ )  $\leq 4k\Delta'$ , the condition of lossless expander holds
  - Let  $S$  be the set of nonzero nodes,  $|\Gamma(S)| \geq (1 - \beta)g|S|$
  - At least 1 node in  $|\Gamma(S)|$  have a unique neighbor in  $S$
  - $m_1$  is nonzero  $\rightarrow$  (weight of  $c_1$ )  $\geq 2k\Delta$
3. If it is larger than  $4k\Delta'$   $\rightarrow$  done
4. Else, weight of  $c_2 \geq 2k\Delta'$  because of lossless expander

# Sampling of the lossless expander

- [Capalbo-Reingold-Vadhan-Wigderson'2002]: Explicit construction of lossless expander (large hidden constant)
- Random sampling:  $1/\text{poly}(n)$  failure probability

# Improvements of the code

- Brakedown [Golovnev-Lee-Setty-Thaler-Wahby'21]: random summations with better concrete distance analysis
- Orion [Xie-Zhang-Song'22]: expander testing with a negligible failure probability via maximum density of the graph

# Putting everything together

Polynomial commitment (and SNARK) based on linear code

- ✓ Transparent setup:  $O(1)$
- ✓ Commit and Prover time:  $O(d)$  field additions and multiplications
- ✓ Plausibly post-quantum secure
- ✓ Field agnostic
  
- ✗ Proof size:  $O(\sqrt{d})$ , MBs

# End of Lecture

Next: FRI and Stark

