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# A Brief Overview of some Quantum Erasure Decoding Algorithms

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Nagoya University Quantum Error Correction Theory Workshop 2025

# Some Erasure Decoding Papers We Will Discuss

	Paper	Decoder	Code Type
[1]	Luby, M. G., Mitzenmacher, M., Shokrollahi, M. A., & Spielman, D. A. (2002). Efficient erasure correcting codes. <i>IEEE Transactions on Information Theory</i> , 47(2), 569-584.	Peeling decoder	Classical linear LDPC codes
[2]	<u>Connolly, N.</u> , Londe, V., Leverrier, A., & Delfosse, N. (2024). Fast erasure decoder for hypergraph product codes. <i>Quantum</i> , 8, 1450.	Pruned peeling and VH decoder	CSS codes and HGP codes
[3]	Delfosse, N., & Zémor, G. (2020). Linear-time maximum likelihood decoding of surface codes over the quantum erasure channel. <i>Physical Review Research</i> , 2(3), 033042.	Surface code spanning-tree peeling decoder	Surface codes
[4]	Delfosse, N., & Nickerson, N. H. (2021). Almost-linear time decoding algorithm for topological codes. <i>Quantum</i> , 5, 595.	Union-find decoder	Surface codes (gen. to qLDPC)
[5]	Nishio, S., <u>Connolly, N.</u> , Piparo, N. L., Munro, W. J., Scruby, T. R., & Nemoto, K. (2025). Multiplexed quantum communication with surface and hypergraph product codes. <i>Quantum</i> , 9, 1613.	Surface peeling and VH decoder (*Application)	Multiplexed toric and HGP codes
[6]	Yao, H., Gökdoğan, M., & Pfister, H. D. (2025). Cluster decomposition for improved erasure decoding of quantum ldpc codes. <i>IEEE Journal on Selected Areas in Information Theory</i> .	Cluster decoder	Any quantum LDPC codes

# (Classical) Tanner Graph Representation of a Code

**Recall:** A (classical binary linear) code  $C$  of length  $n$  is a subspace of  $F_2^n$ .

- $C$  is the kernel of a parity check matrix  $H$ .
- The vectors of this subspace are the codewords of  $C$ .
- The length  $n$  of  $C$  is the number of “bits” per codeword.
- The dimension is  $k = n - \text{rank}(H)$ .

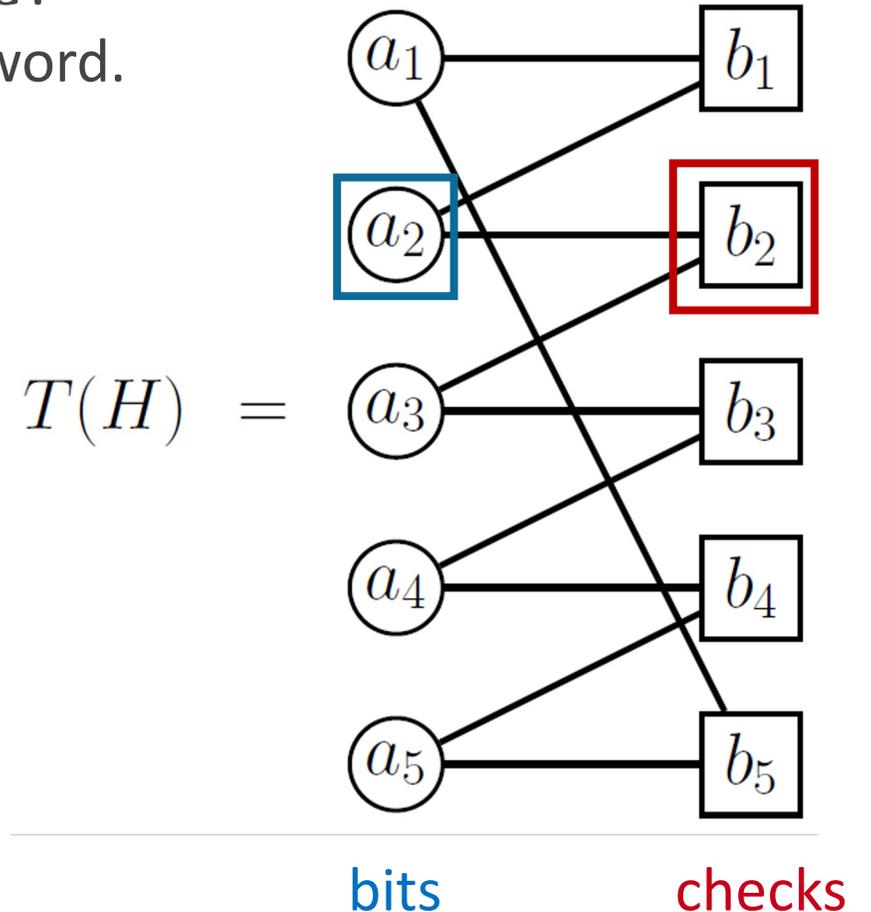
$$H = \begin{bmatrix} 1 & 1 & 0 & 0 & 0 \\ 0 & 1 & 1 & 0 & 0 \\ 0 & 0 & 1 & 1 & 0 \\ 0 & 0 & 0 & 1 & 1 \\ 1 & 0 & 0 & 0 & 1 \end{bmatrix}$$

bit  $a_2$   
check  $b_2$

$$\ker(H) = \left\{ \begin{bmatrix} 0 \\ 0 \\ 0 \\ 0 \\ 0 \end{bmatrix}, \begin{bmatrix} 1 \\ 1 \\ 1 \\ 1 \\ 1 \end{bmatrix} \right\}$$

The Tanner Graph of  $C = \ker(H)$  is the bipartite graph  $T(H)$  defined using  $H$  as a bi-adjacency matrix

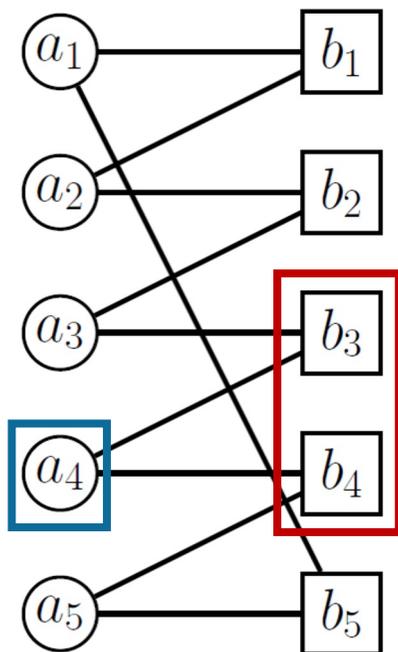
- Columns of  $H$  are bits of  $T(H)$  (circle nodes).
- Rows of  $H$  are checks of  $T(H)$  (square nodes).





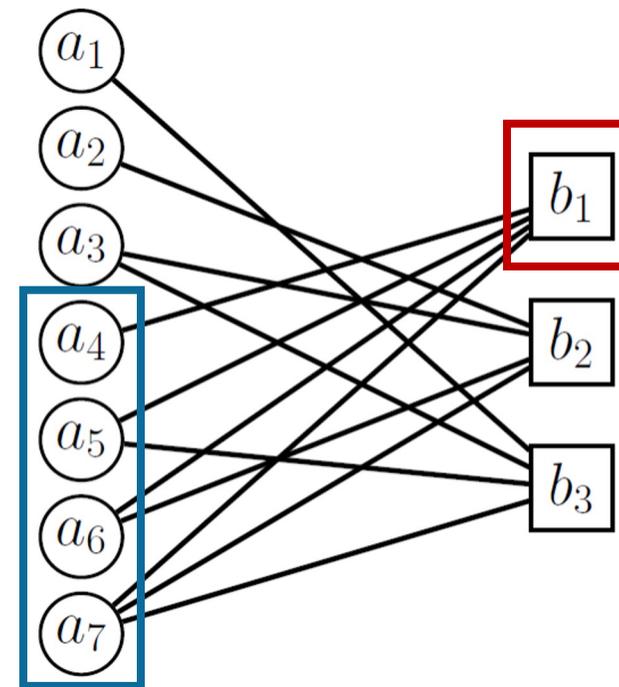
# Examples of Parity Check Matrices and Tanner Graphs

$$\begin{bmatrix} 1 & 1 & 0 & 0 & 0 \\ 0 & 1 & 1 & 0 & 0 \\ 0 & 0 & 1 & 1 & 0 \\ 0 & 0 & 0 & 1 & 1 \\ 1 & 0 & 0 & 0 & 1 \end{bmatrix}$$



5-bit repetition code

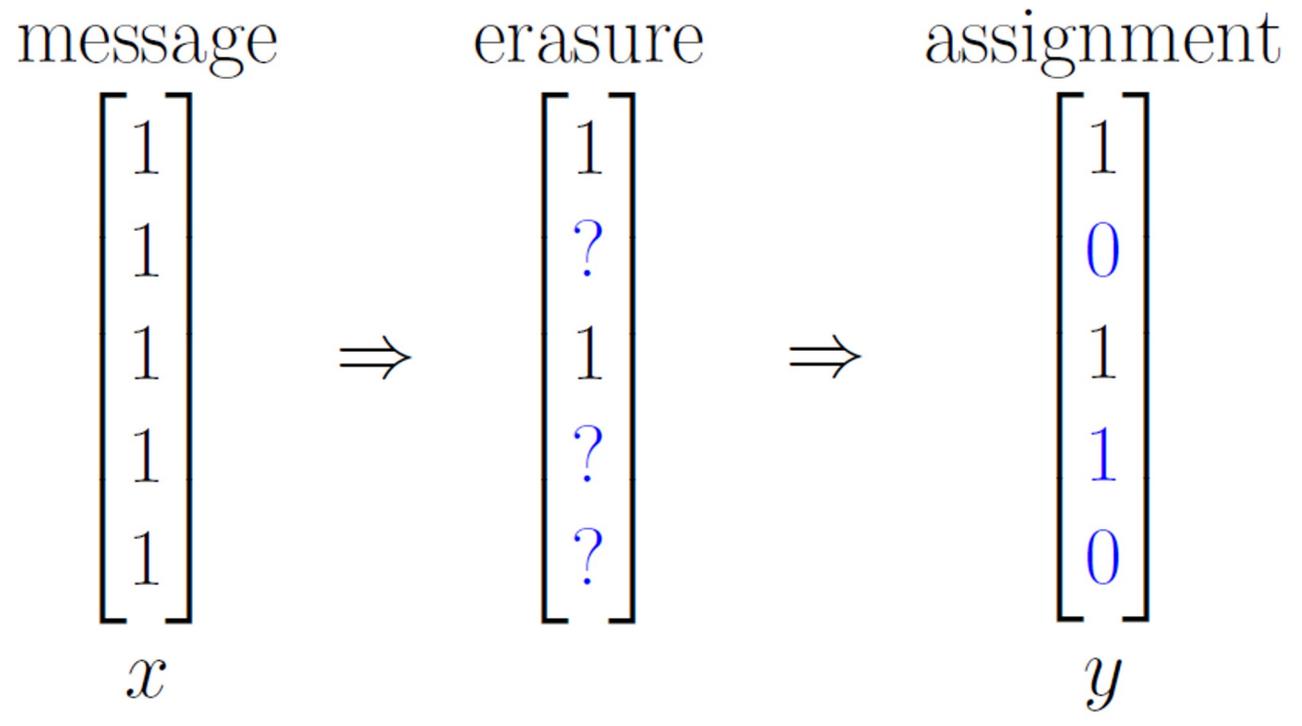
$$\begin{bmatrix} 0 & 0 & 0 & 1 & 1 & 1 & 1 \\ 0 & 1 & 1 & 0 & 0 & 1 & 1 \\ 1 & 0 & 1 & 0 & 1 & 0 & 1 \end{bmatrix}$$



[7,4,3] Hamming code  
(used in Steane code)

# (Classical) Binary Erasure Channel and Correction

- A codeword  $x \in \ker(H)$  is sent through a noisy erasure channel.
- Each bit in the message  $x$  is erased (lost) with probability  $p$ .
- Erased bits can be replaced with random bits (0 or 1), yielding corrupted codeword  $y$ .
- Corrupted codeword  $y$  can be corrected using standard (bit-flip) error correction.
- **Additional information:** non-erased bits are known to be correct!



# Erasure-Induced Subgraph of the Tanner Graph

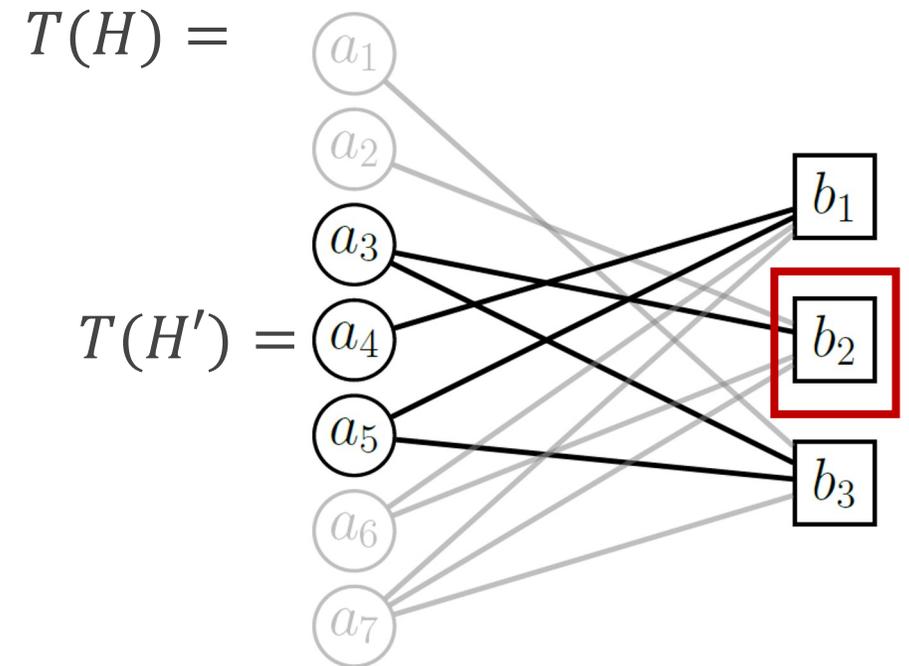
- The “erased” part of a codeword  $x \in \ker(H)$  can be viewed inside a subcode.
- The submatrix of  $H$  corresponding to erased bits in  $x$  defines a subgraph of  $T(H)$ .
- Degree-1 check nodes in the subgraph carry perfect information about adjacent bits.

$$x = \begin{bmatrix} 1 \\ 1 \\ ? \\ ? \\ ? \\ 1 \\ 0 \end{bmatrix}$$

$$x' = \begin{bmatrix} ? \\ ? \\ ? \end{bmatrix}$$

$$H = \begin{bmatrix} 0 & 0 & 0 & 1 & 1 & 1 & 1 \\ 0 & 1 & 1 & 0 & 0 & 1 & 1 \\ 1 & 0 & 1 & 0 & 1 & 0 & 1 \end{bmatrix}$$

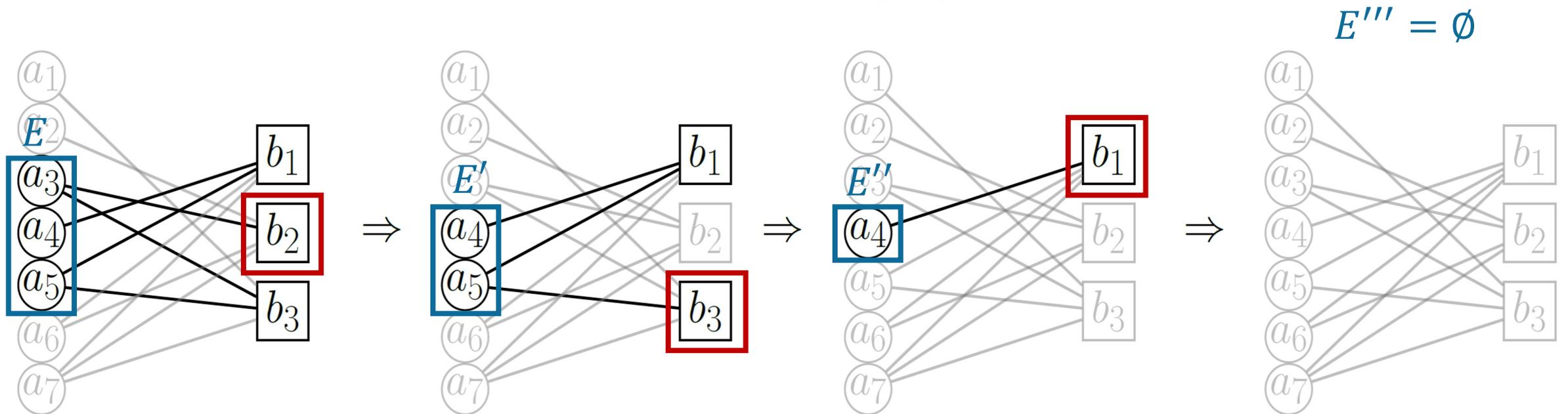
$$H' = \begin{bmatrix} 0 & 1 & 1 \\ 1 & 0 & 1 \end{bmatrix}$$





# Classical Peeling Decoder Algorithm

1. Given erasure vector  $E \in F_2^n$ , consider the erasure-induced subgraph of  $T(H)$ .
2. Select a dangling (degree 1) check in this subgraph.
3. Correct the value of the single adjacent erased bit based on the dangling check.
4. Remove this bit from  $E$ , shrinking in the erasure (“peeling”).
5. Repeat until the erasure is empty, or no dangling checks remain.





# Stopping Sets for the Peeling Decoder

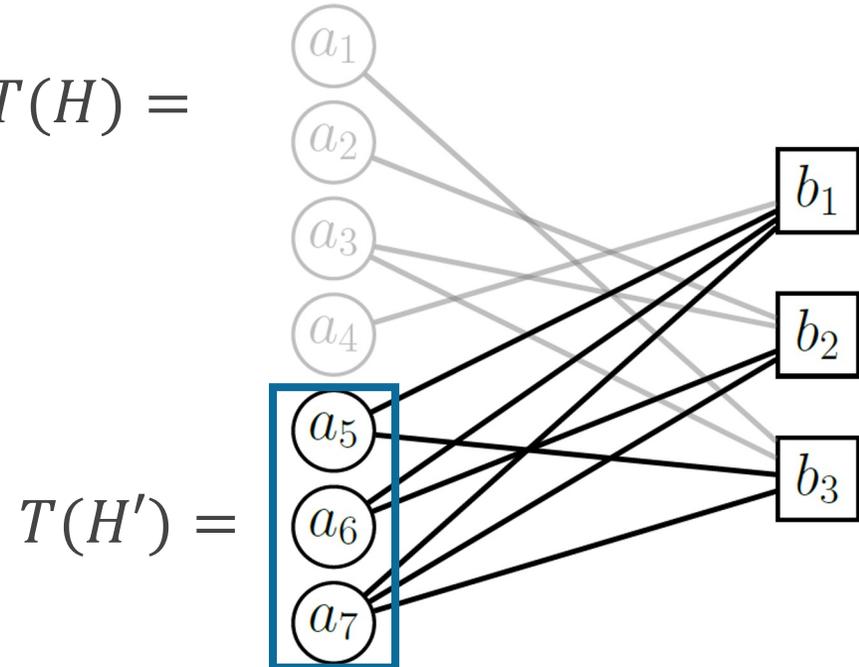
- A decoding success or failure depends *only* on the erasure vector.
- Success occurs if there exists a sequence of dangling checks that peel the whole erasure.
- Failure occurs when there exists a non-empty erasure vector with no dangling checks.
- An erasure-induced subgraph of  $T(H)$  with no dangling checks is called a stopping set.
- Tanner graphs for sparse (LDPC) codes have fewer stopping sets.

$H =$

$$\begin{bmatrix} 0 & 0 & 0 & 1 & 1 & 1 & 1 \\ 0 & 1 & 1 & 0 & 0 & 1 & 1 \\ 1 & 0 & 1 & 0 & 1 & 0 & 1 \end{bmatrix}$$

$H' =$

$T(H) =$



$T(H') =$

stopping set

No dangling checks

# Review: Quantum CSS Codes from Classical Codes

- A quantum code of length  $N$  and dimension  $K$  is a subspace of a Hilbert space.
  - Vectors are  $N$ -qubit states  $|\psi\rangle \in \mathcal{C}^N$ .
  - Errors on  $|\psi\rangle$  are represented by  $N$ -qubit Pauli operators in  $P_N = \{I, X, Y, Z\}^{\otimes N}$ .
- A stabilizer code is the space of states left fixed by a subgroup of the Pauli group  $P_N$ .
  - Defined by a set of stabilizer generators  $\langle g_1, \dots, g_r \rangle = G \subseteq P_N$
- A CSS code  $C = CSS(C_X, C_Z)$  is a stabilizer code defined from two classical codes.
  - Defined by *commuting* Pauli  $X$ - and  $Z$ -operators as stabilizer generators.
  - These define the rows of matrices  $H_X$  and  $H_Z$  satisfying  $H_X H_Z^T = 0$  (commutivity).
  - $Z$ - and  $X$ -error correction is modeled by classical  $C_X = \ker(H_X)$  and  $C_Z = \ker(H_Z)$ .

## Example:

Steane Code

$$H_X = H_Z = \begin{bmatrix} 0 & 0 & 0 & 1 & 1 & 1 & 1 \\ 0 & 1 & 1 & 0 & 0 & 1 & 1 \\ 1 & 0 & 1 & 0 & 1 & 0 & 1 \end{bmatrix}$$

$X$ -stabilizers:

IIIXXXX  
IXXIIXX  
XIXIXIX

$Z$ -stabilizers:

IIIZZZZ  
IZZIIZZ  
ZIZIZIZ

$\in P_7$



# (Quantum) Peeling Decoder for CSS Codes

- For CSS code  $C = CSS(C_X, C_Z)$ ,  $X$ - and  $Z$ -type Pauli errors can be corrected separately.
- Pauli errors in  $P_N$  can be mapped onto binary strings in  $Z_2^N$ .

$$E = X_1 Z_1 X_2 Z_4 \in P_4 \Leftrightarrow e_X = \begin{bmatrix} 1 \\ 1 \\ 0 \\ 0 \end{bmatrix} \quad e_Z = \begin{bmatrix} 1 \\ 0 \\ 0 \\ 1 \end{bmatrix}$$

- Pauli error correction is modeled by classical error correction with  $C_X$  and  $C_Z$ .
- For erasure errors, the Peeling Decoder can be directly applied.
- However, it works poorly due to certain quantum features.



# Hypergraph Product (HGP) Codes

## Theorem (Tillich-Zémor):

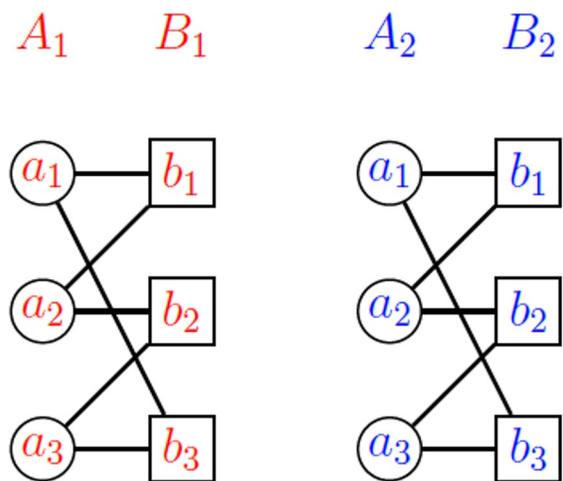
The Hypergraph Product code  $C = HGP(C_1, C_2)$  of two classical codes  $C_1 = \ker(H_1)$  and  $C_2 = \ker(H_2)$  is the quantum code  $C = CSS(C_X, C_Z)$ , where  $C_X = \ker(H_X)$  and  $C_Z = \ker(H_Z)$  have parity check matrices  $H_X$  and  $H_Z$  defined from  $H_1$  and  $H_2$ .

$$\begin{aligned} H_X &= \left[ \begin{array}{c|c} H_1 \otimes I & I \otimes H_2^T \end{array} \right] \\ H_Z &= \left[ \begin{array}{c|c} I \otimes H_2 & H_1^T \otimes I \end{array} \right] \end{aligned}$$

- The matrices have sizes  $H_1 = [r_1 \times n_1]$ ,  $H_2 = [r_2 \times n_2]$ , so  $H_X = [r_1 n_2 \times (n_1 n_2 + r_1 r_2)]$ ,  $H_Z = [r_2 n_1 \times (n_1 n_2 + r_1 r_2)]$ .
- $C$  has length  $N = n_1 n_2 + r_1 r_2$  and dimension  $K = N - \text{rank}(H_X) - \text{rank}(H_Z)$ .
- $C$  has minimum distance  $\min(d_1, d_2)$  where  $d_1$  and  $d_2$  are the minimum distances of  $C_1$  and  $C_2$ .

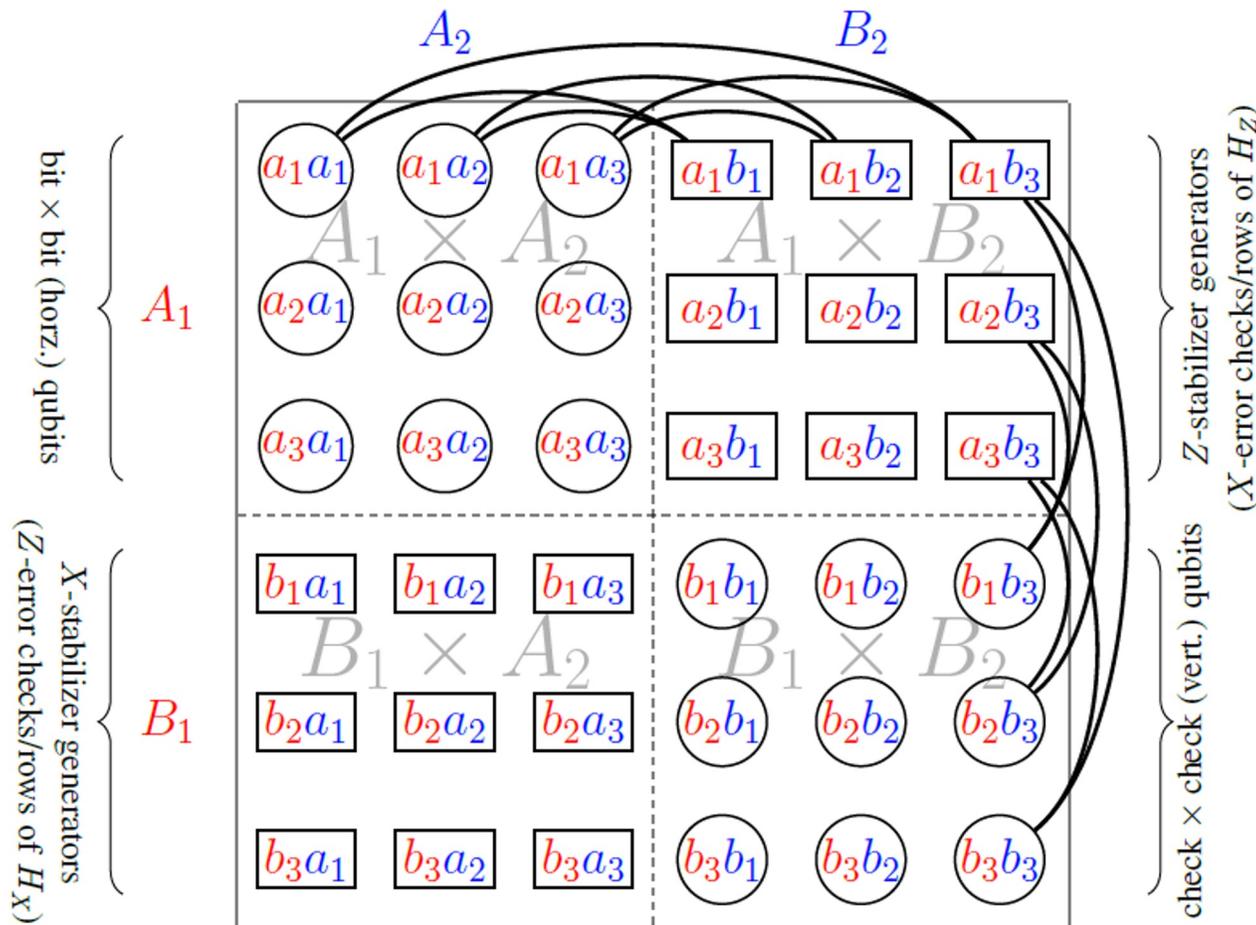


# Tanner Graph Structure of Hypergraph Product Codes



$$T(H_1) \cong T(H_2)$$

$$H_1 = \begin{bmatrix} 1 & 1 & 0 \\ 0 & 1 & 1 \\ 1 & 0 & 1 \end{bmatrix} = H_2$$



$$H_Z = \begin{bmatrix} 11000000 & 10000100 \\ 01100000 & 01000010 \\ 10100000 & 00100001 \\ 00011000 & 10010000 \\ 00001100 & 01001000 \\ 00010100 & 00100100 \\ 000000110 & 000100100 \\ 000000011 & 000010010 \\ 000000101 & 000001001 \end{bmatrix}$$

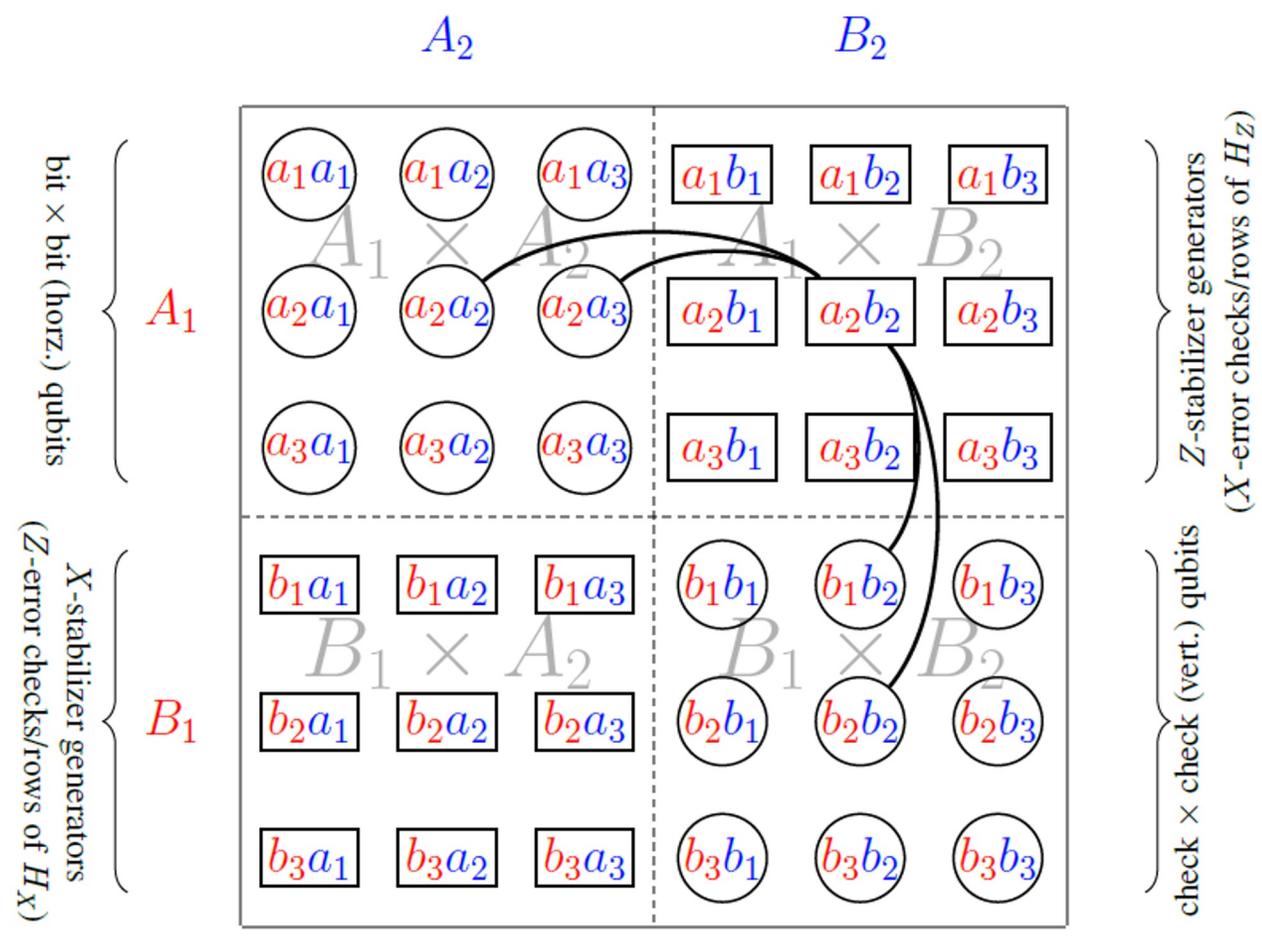
$$[ I \otimes H_2 \mid H_1^T \otimes I ]$$

$$H_X = \begin{bmatrix} 10010000 & 10100000 \\ 01001000 & 11000000 \\ 00100100 & 01100000 \\ 00010010 & 00010100 \\ 000010010 & 00011000 \\ 000001001 & 00001100 \\ 100000100 & 00000101 \\ 010000010 & 000000110 \\ 001000001 & 000000011 \end{bmatrix}$$

$$[ H_1 \otimes I \mid I \otimes H_2^T ]$$



# HGP Code: Z-Type Stabilizer Generators



$$H_Z = \begin{bmatrix} 11000000 & 100000100 \\ 01100000 & 01000010 \\ 10100000 & 00100001 \\ 00011000 & 10010000 \\ 00010100 & 00100100 \\ 00000011 & 00010010 \\ 00000010 & 00000100 \end{bmatrix}$$

$a_2 a_3$   $a_2 a_2$   $b_1 b_2$   $b_2 b_2$

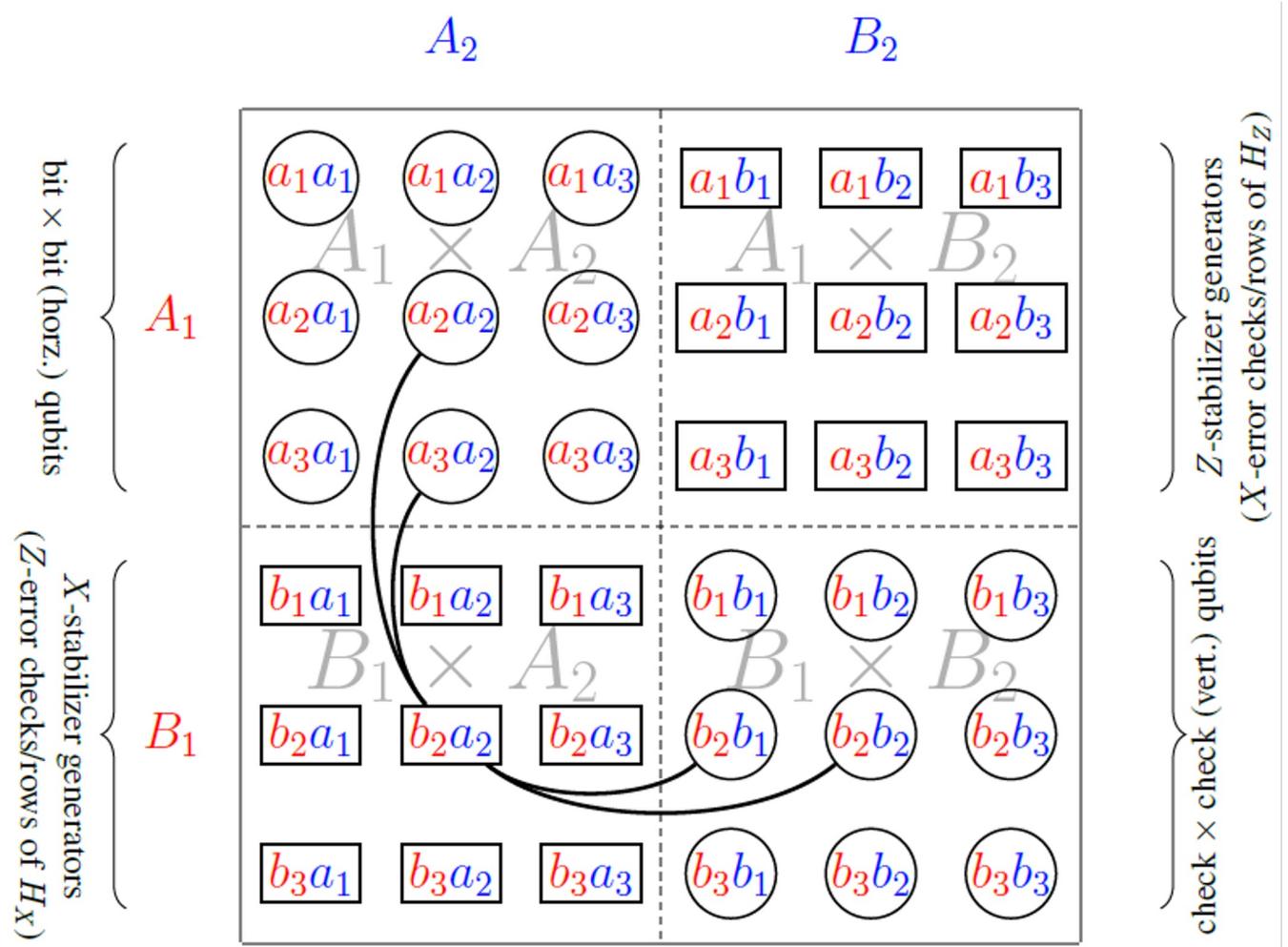
$$\left[ I \otimes H_2 \mid H_1^T \otimes I \right]$$



# HGP Code: X-Type Stabilizer Generators

$$H_X = \begin{bmatrix}
 100100000 & 101000000 \\
 010010000 & 110000000 \\
 001001000 & 011000000 \\
 000100100 & 000101000 \\
 \color{red}{000010010} & \color{red}{000110000} \\
 000001001 & 000011000 \\
 100000100 & 000000101 \\
 010000010 & 000000110 \\
 001000001 & 000000011
 \end{bmatrix}$$

$\left[ \begin{array}{c|c} H_1 \otimes I & I \otimes H_2^T \end{array} \right]$



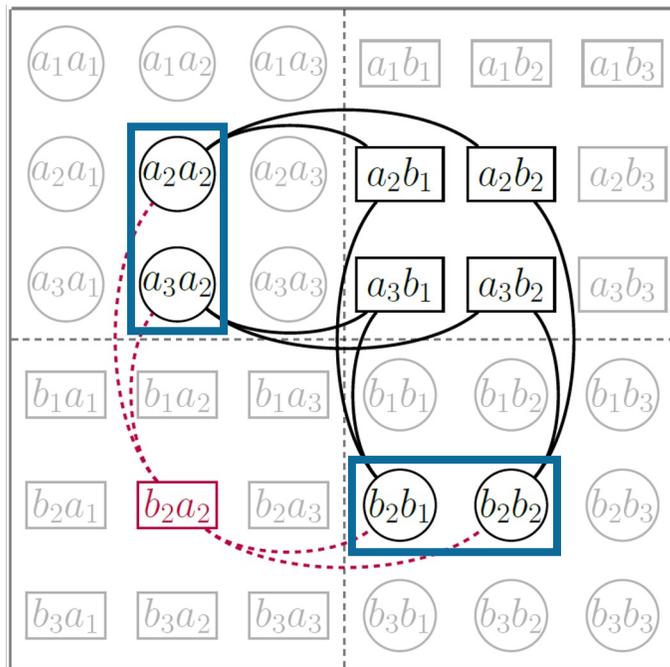




# Stabilizer Stopping Sets and the Pruned Peeling Decoder

- The qubit-support of an  $X$ - or  $Z$ -stabilizer is a stopping set of  $\ker(H_Z)$  or  $\ker(H_X)$ .
  - This is a consequence of commuting  $X$ - and  $Z$ -stabilizers for CSS codes.
- Break the stopping set by removing a single qubit from the erasure.
  - This is valid thanks to a feature of stabilizer codes.
- If there are new dangling checks, continue peeling.

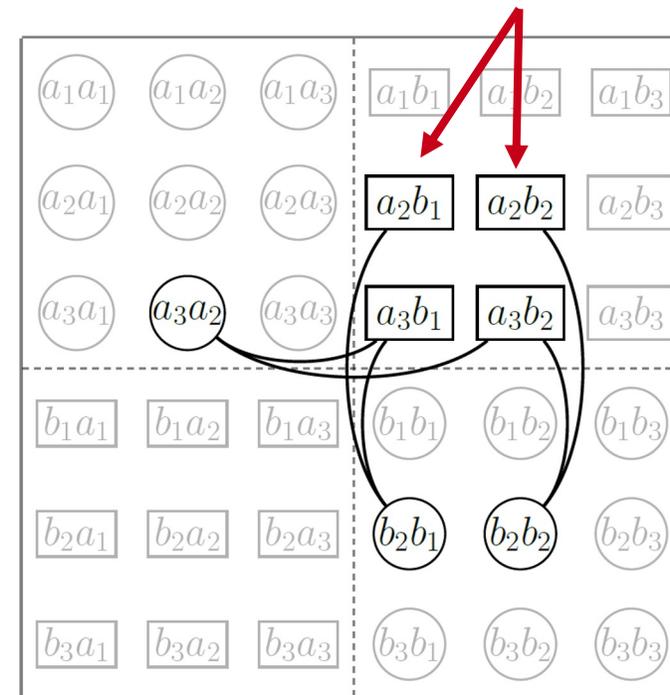
stabilizer stopping set



break stopping set



new dangling checks

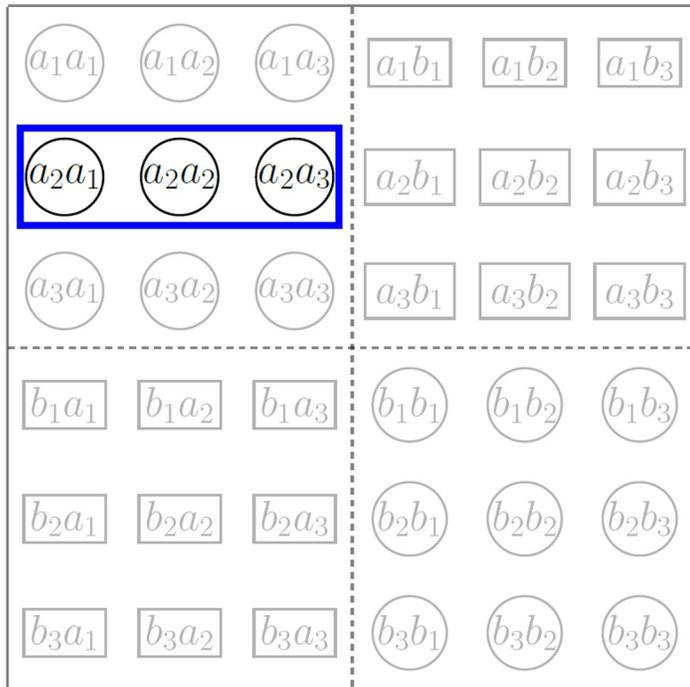




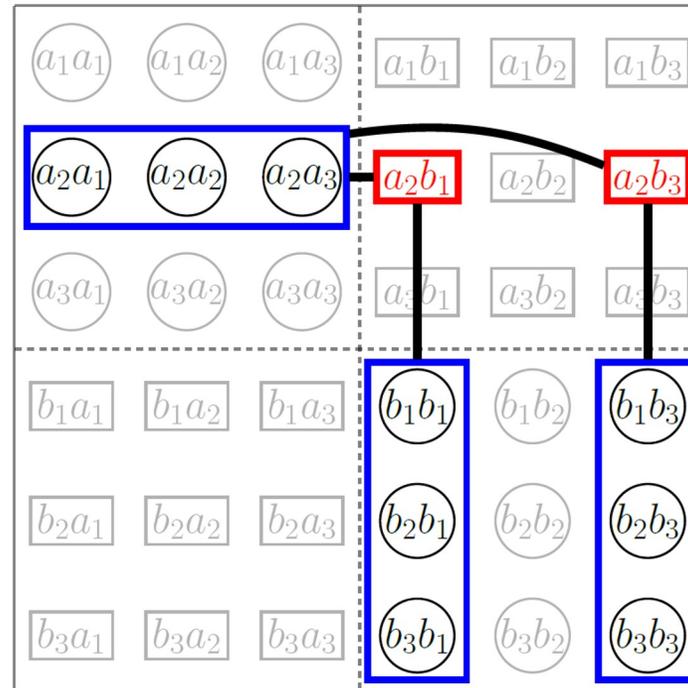


# Types of Cluster Configurations in the VH Graph

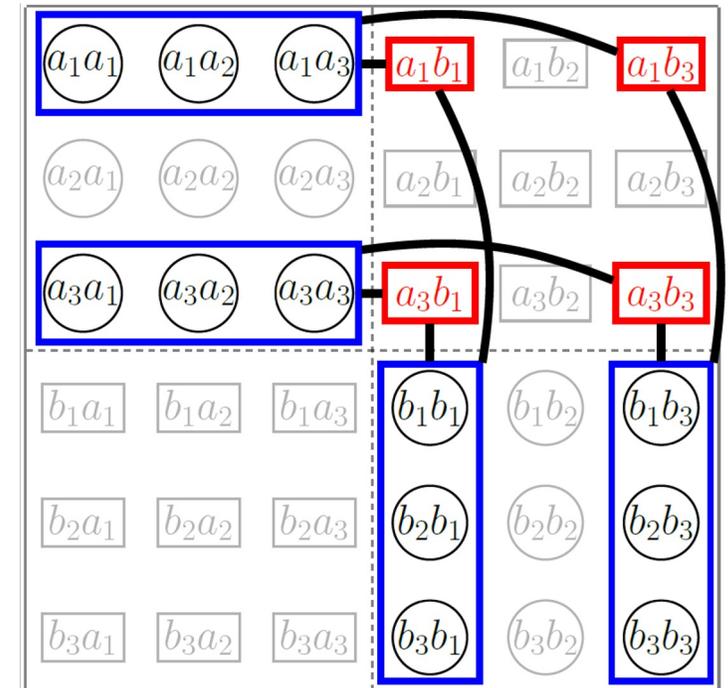
- **Vertices:** classical stopping set clusters in the same row/column
- **Edges:** checks shared between two clusters



Isolated Cluster



Cluster Tree



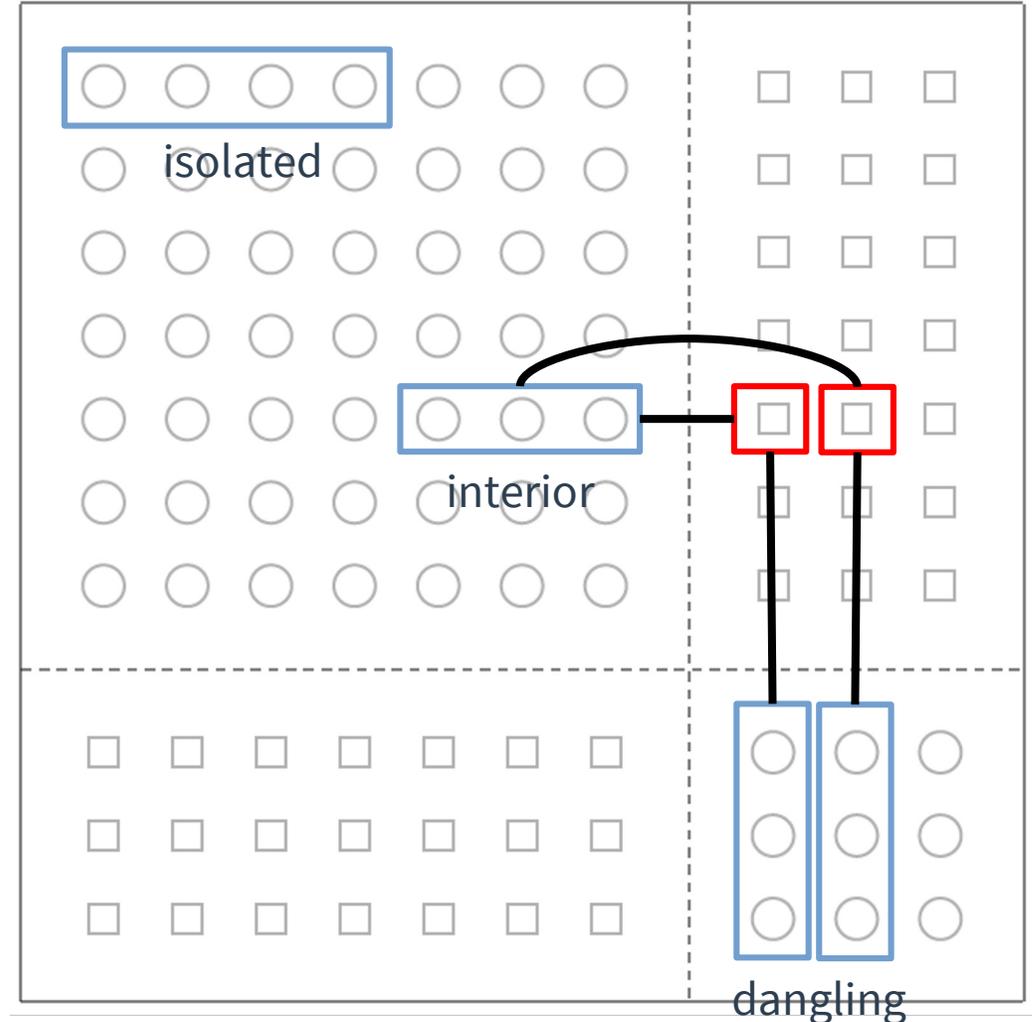
Cluster Cycle



# The VH Decoder for HGP Codes

- A peeling decoder stopping set is clustered into the VH graph.
  - Isolated, dangling, or interior
  - Solvable via Gaussian elimination
- Clusters are solved in sequentially\*.
  - Eliminate all isolated clusters.
  - Peel dangling clusters from trees.
  - \*(Accounting for *free vs frozen*)
- Terminates when all clusters are solved, or a cluster cycle remains.
- $O(N^2)$  complexity on code length  $N$ .

Connolly, N., Londe, V., Leverrier, A., & Delfosse, N. (2024). Fast erasure decoder for hypergraph product codes. *Quantum*, 8, 1450.





# Peeling, Pruned Peeling, and VH-Decoder Pseudocode

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## Algorithm 1: Classical peeling decoder

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**input** : An erasure vector  $\varepsilon \in \mathbb{Z}_2^N$  and a syndrome  $s \in \mathbb{Z}_2^r$ .

**output**: Either **failure** or  $\hat{e} \in \mathbb{Z}_2^n$  such that  $H\hat{e} = s$  and  $\text{supp}(\hat{e}) \subseteq \text{supp}(\varepsilon)$ .

```

1 Set  $\hat{e} = 0$ .
2 while there exists a dangling check do
3   Select a dangling check  $c_i$ .
4   Let  $b_j$  be the dangling bit incident to  $c_i$ .
5   if  $s_i = 1$  then
6     Flip the  $j$ -th bit of  $\hat{e}$ .
7     Flip  $s_k$  for all checks  $c_k$  incident with  $b_j$ .
8   Set  $\varepsilon_j = 0$ .
9 if  $\varepsilon \neq 0$  return Failure, else return  $\hat{e}$ .
```

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## Algorithm 2: Pruned peeling decoder

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**input** : An erasure vector  $\varepsilon \in \mathbb{Z}_2^N$ , a syndrome  $s \in \mathbb{Z}_2^{RZ}$ , and an integer  $M$ .

**output**: Either **Failure** or an  $X$ -type error  $\hat{E} \in \{I, X\}^N$  such that  $\sigma(\hat{E}) = s$  and  $\text{supp}(\hat{E}) \subseteq \text{supp}(\varepsilon)$ .

```

1 Set  $\hat{E} = I$ .
2 while there exists a dangling generator do
3   Select a dangling generator  $S_{Z,i}$ .
4   Let  $j$  be the index of the dangling qubit incident to  $S_{Z,i}$ .
5   if  $s_i = 1$  then
6     Replace  $\hat{E}$  by  $\hat{E}X_j$  and  $s$  by  $s + \sigma(X_j)$ .
7   Set  $\varepsilon_j = 0$ .
8 if there exists a product  $S$  of up to  $M$  stabilizer generators among  $S_{X,1}, \dots, S_{X,R_X}$  such that  $\text{supp}(S) \subseteq \text{supp}(\varepsilon)$  then
9   Select a qubit in  $\text{supp}(S)$  with index  $j$  and set  $\varepsilon_j = 0$ .
10  Go back to step 2.
11 if  $\varepsilon \neq 0$  return Failure, else return  $\hat{E}$ .
```

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## Algorithm 3: VH decoder

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**input** : An erasure vector  $\varepsilon \in \mathbb{Z}_2^N$ , a syndrome  $s \in \mathbb{Z}_2^{RZ}$ .

**output**: Either **Failure** or an  $X$ -type error  $\hat{E} \in \{I, X\}^N$  such that  $\sigma(\hat{E}) = s$  and  $\text{supp}(\hat{E}) \subseteq \text{supp}(\varepsilon)$ .

```

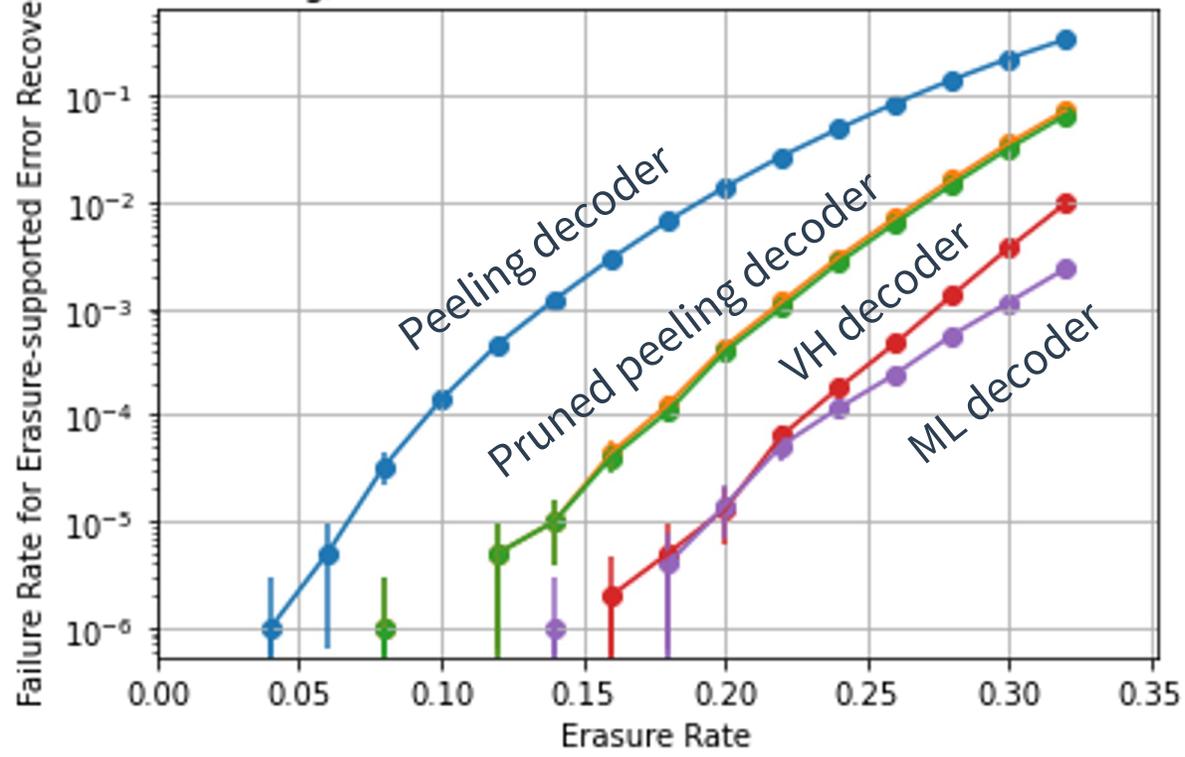
1 Set  $\hat{E} = I$ .
2 Construct an empty stack  $L = []$ .
3 while there exists an isolated or a dangling cluster  $\kappa$  do
4   if  $\kappa$  is isolated or frozen then
5     Compute an error  $\hat{E}_\kappa$  supported on  $\kappa$  whose syndrome matches  $s$  on the internal checks of  $\kappa$  in  $T(\mathbf{H}_Z)$  (using the Gaussian decoder).
6     Replace  $\hat{E}$  by  $\hat{E}\hat{E}_\kappa$  and  $s$  by  $s + \sigma(\hat{E}_\kappa)$ .
7     For all qubits  $j$  in  $\kappa$ , set  $\varepsilon_j = 0$ .
8   else
9     Then  $\kappa$  is free.
10    Remove the free connecting check  $c$  of  $\kappa$  from the Tanner graph  $T(\mathbf{H}_Z)$ .
11    Add the pair  $(\kappa, c)$  to the stack  $L$ .
12    For all qubits  $j$  in  $\kappa$ , set  $\varepsilon_j = 0$ .
13 while the stack  $L$  is non-empty do
14   Pop a cluster  $(\kappa, c)$  from the stack  $L$ .
15   Add the check node  $c$  to the Tanner graph  $T(\mathbf{H}_Z)$ .
16   Compute an error  $\hat{E}_\kappa$  supported on  $\kappa$  whose syndrome matches  $s$  on all the checks of  $\kappa$  in  $T(\mathbf{H}_Z)$ , including the free check  $c$  (using the Gaussian decoder).
17   Replace  $\hat{E}$  by  $\hat{E}\hat{E}_\kappa$  and  $s$  by  $s + \sigma(\hat{E}_\kappa)$ .
18 if  $\varepsilon \neq 0$  return Failure, else return  $\hat{E}$ .
```

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# Comparison of Decoder Performances with HGP Codes

Pruned Peeling/VH Decoder Performance with [2025,81] HGP Code



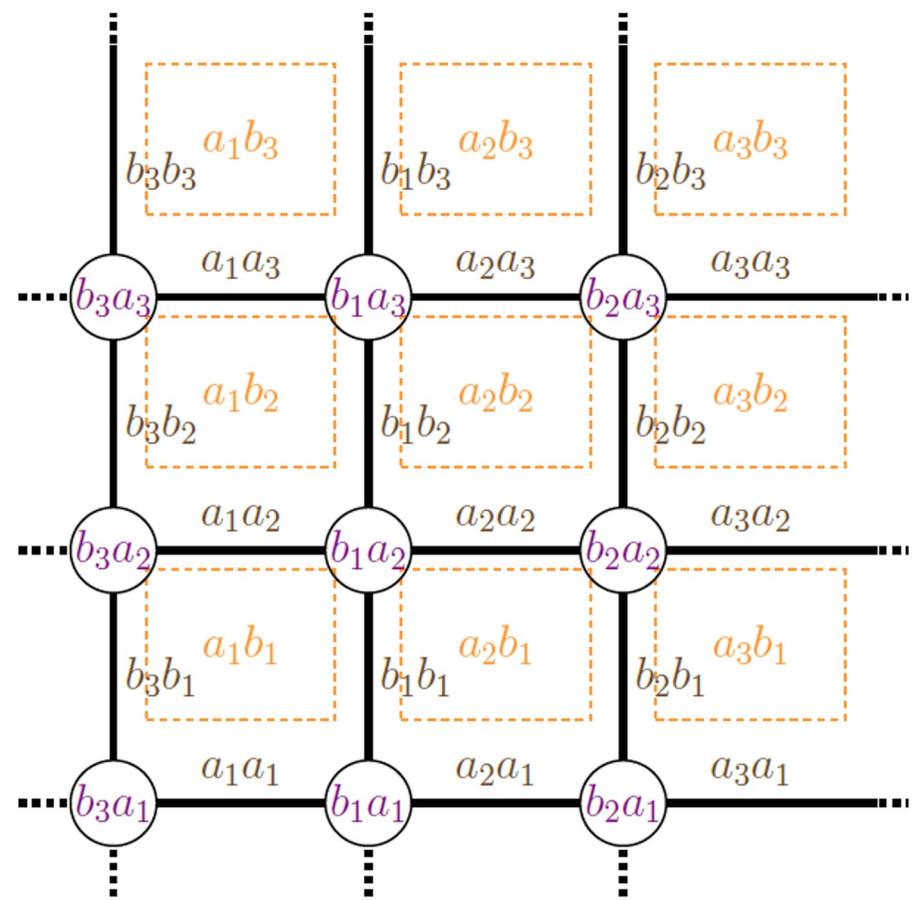
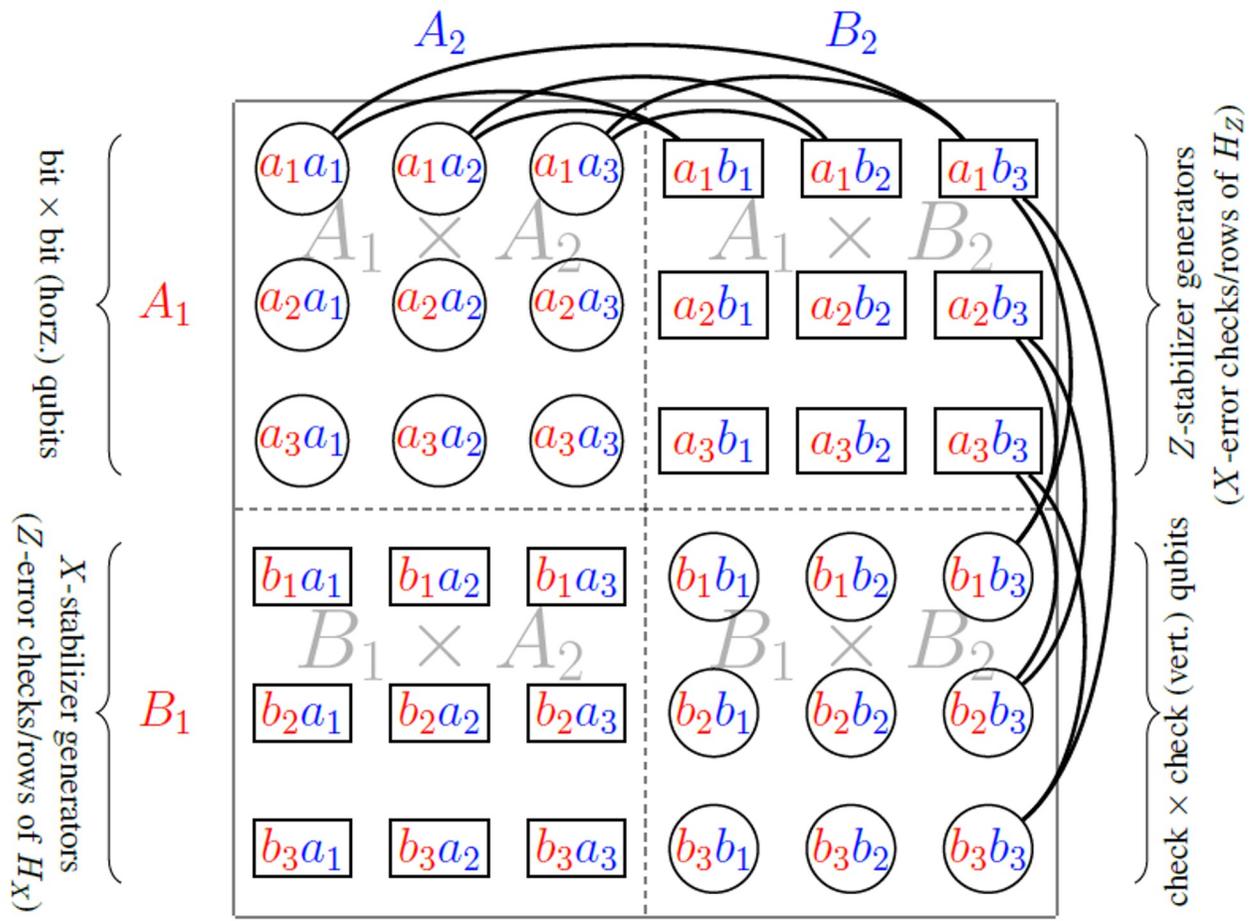
Number of qubits: 2025  
Maximum erasure rate: 0.32  
Number of different erasure rates: 16  
Randomized trials per data point (pruned peeling and VH decoder):  $10^6$   
Randomized trials per data point (Gaussian decoder):  $10^6$   
y-axis scaling: logarithmic

- pruned peeling decoder (M=0)
- pruned peeling decoder (M=1)
- pruned peeling decoder (M=2)
- pruned peeling (M=2) + VH decoder
- Gaussian decoder

Connolly, N., Londe, V., Leverrier, A., & Delfosse, N. (2024). Fast erasure decoder for hypergraph product codes. *Quantum*, 8, 1450.

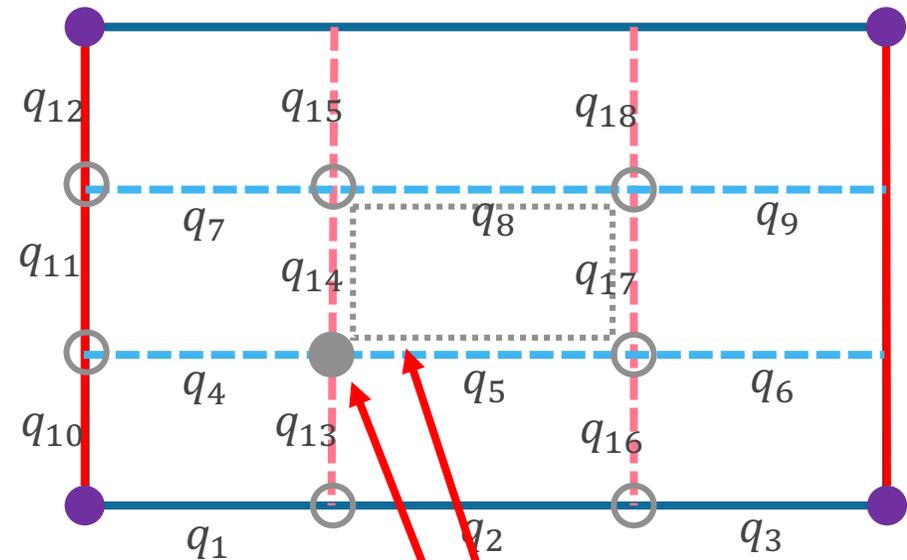
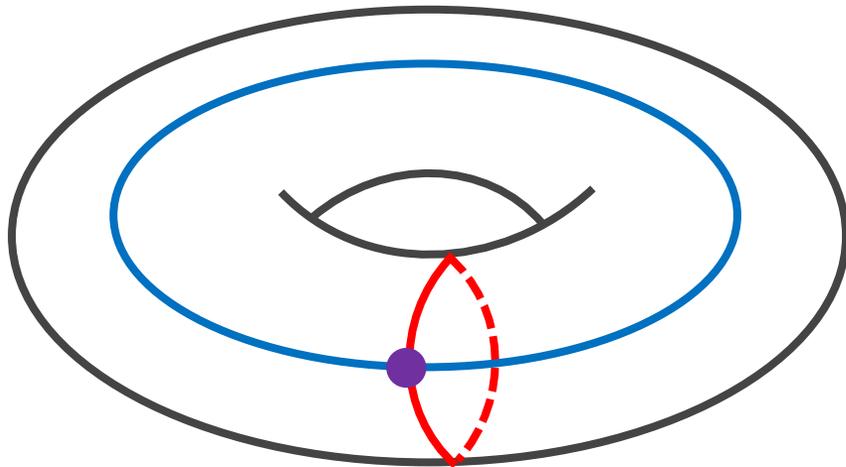


# Aside: Toric Code HGP Picture versus Lattice Picture





# The Geometric Structure of the Toric Code



The toric code is a stabilizer code defined via the lattice representation of the torus.

- **Edges** define qubits
- **Vertices** define  $X$ -stabilizer generators
- **Plaquettes** define  $Z$ -stabilizer generators

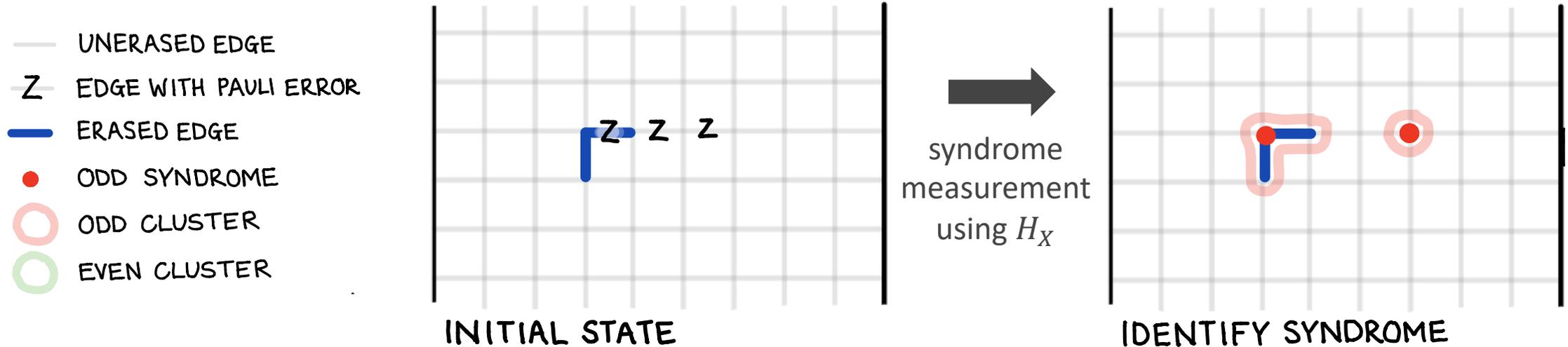
$$g_Z = Z_5 Z_8 Z_{14} Z_{17}$$

$$g_X = X_4 X_5 X_{13} X_{14}$$



# Visualizing Errors and Syndromes in the Toric Code

- A mixed error channel includes both erasures and Pauli errors.
- Erased qubits are still assigned random values (erasure pattern is known).
- $Z$ -Pauli errors on qubits (edges) are identified by  $X$ -checks (vertices).
- The syndrome consists of triggered-vertices and erased edges.
- Corrections are chains of Paulis connecting pairs of triggered-vertices.

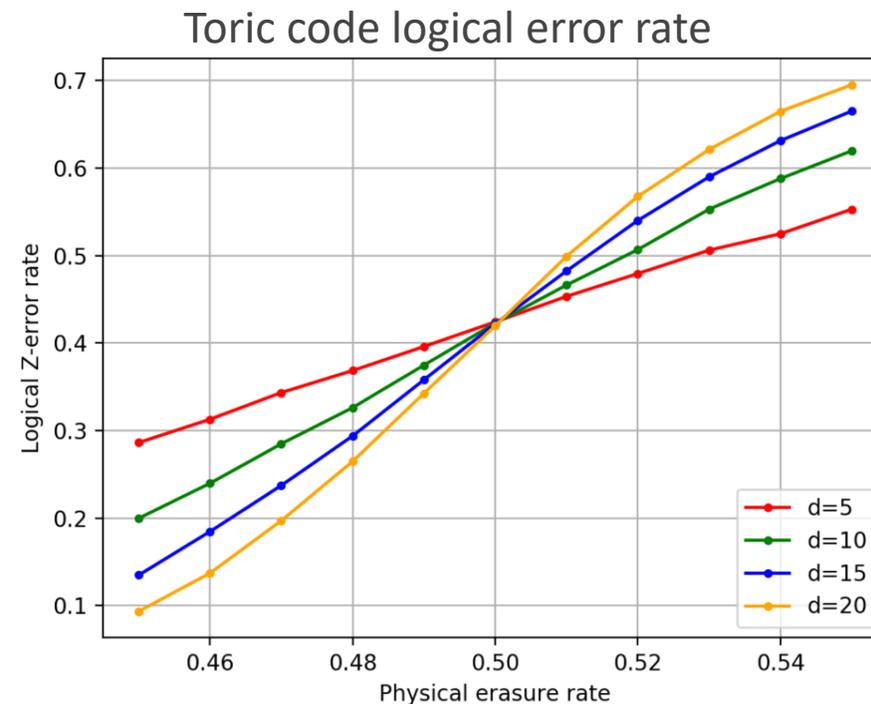
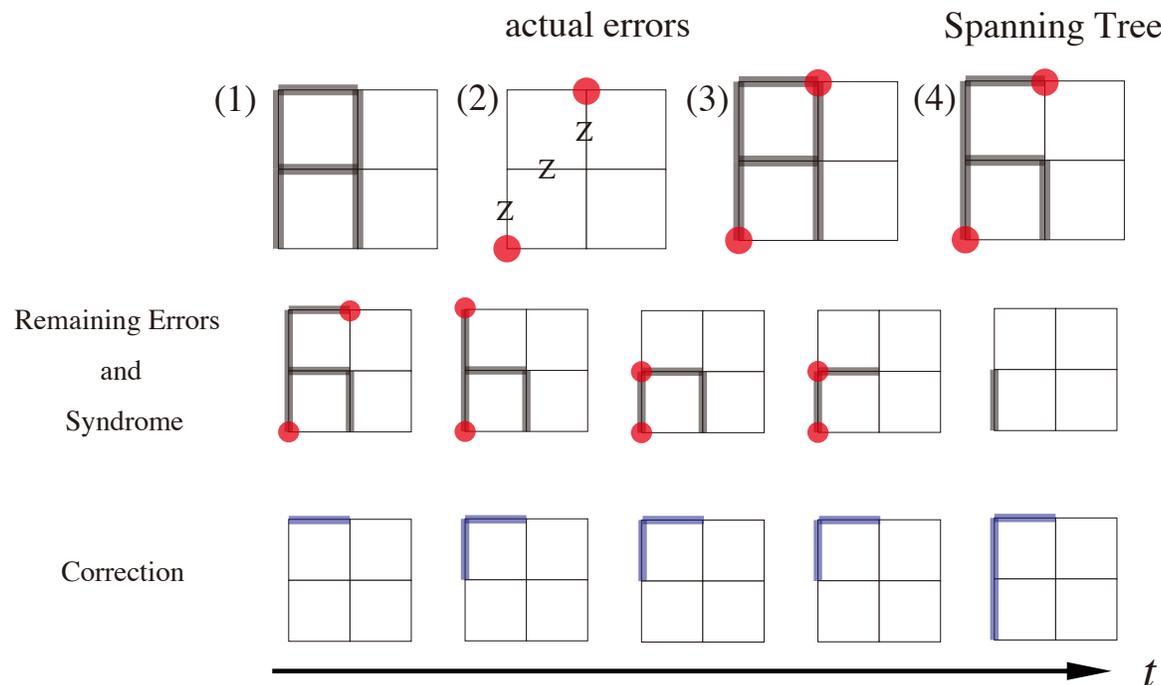


Delfosse, N., & Nickerson, N. H. (2021). Almost-linear time decoding algorithm for topological codes. *Quantum*, 5, 595.





# Surface Code Spanning-Tree Peeling Decoder



- Using an erasure spanning-tree, erased qubits can be corrected and peeled.
- This process is linear complexity in the code length (*really fast*).
- Furthermore, this is a *maximum likelihood* decoder (*as good as possible*).

(left) Nishio, S., [Connolly, N.](#), Piparo, N. L., Munro, W. J., Scruby, T. R., & Nemoto, K. (2025). Multiplexed quantum communication with surface and hypergraph product codes. *Quantum*, 9, 1613.

(right) Delfosse, N., & Zémor, G. (2020). Linear-time maximum likelihood decoding of surface codes over the quantum erasure channel. *Physical Review Research*, 2(3), 033042.

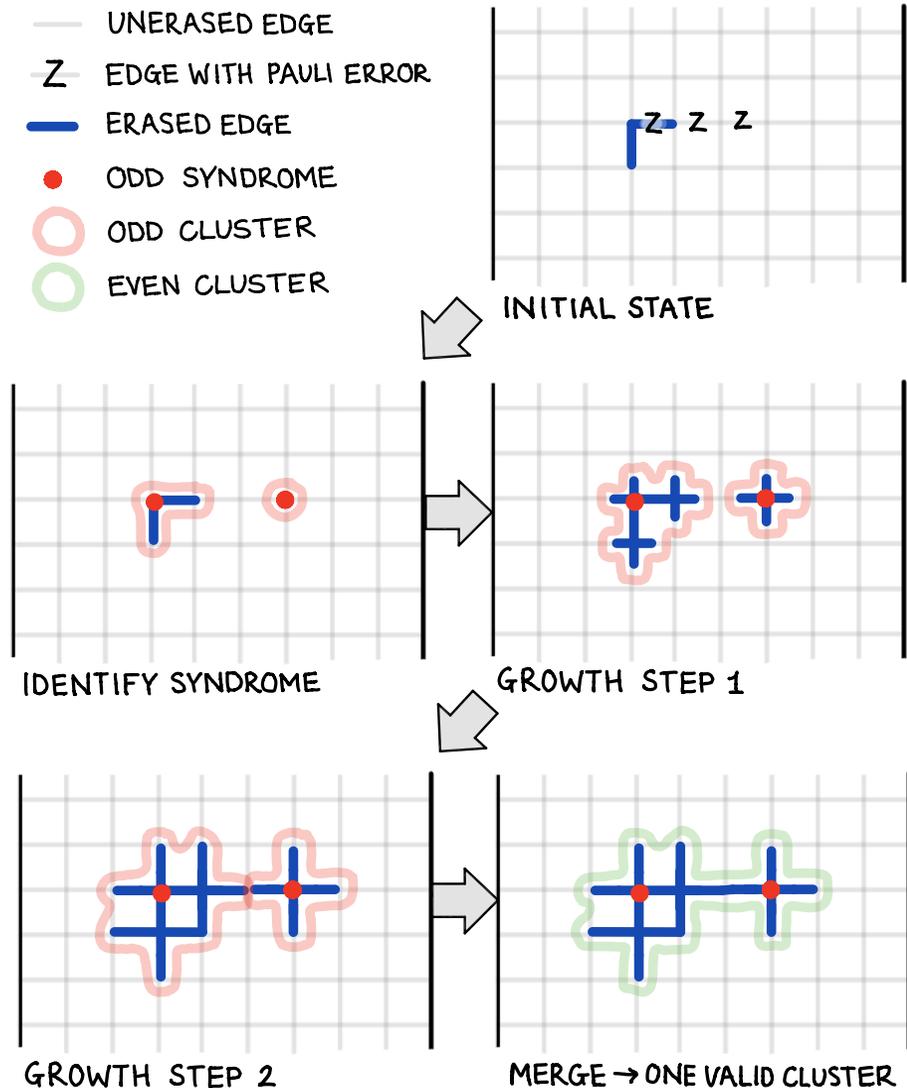


# Union-Find Decoder for Surface Codes

The Union-Find decoder exploits several features of the toric code.

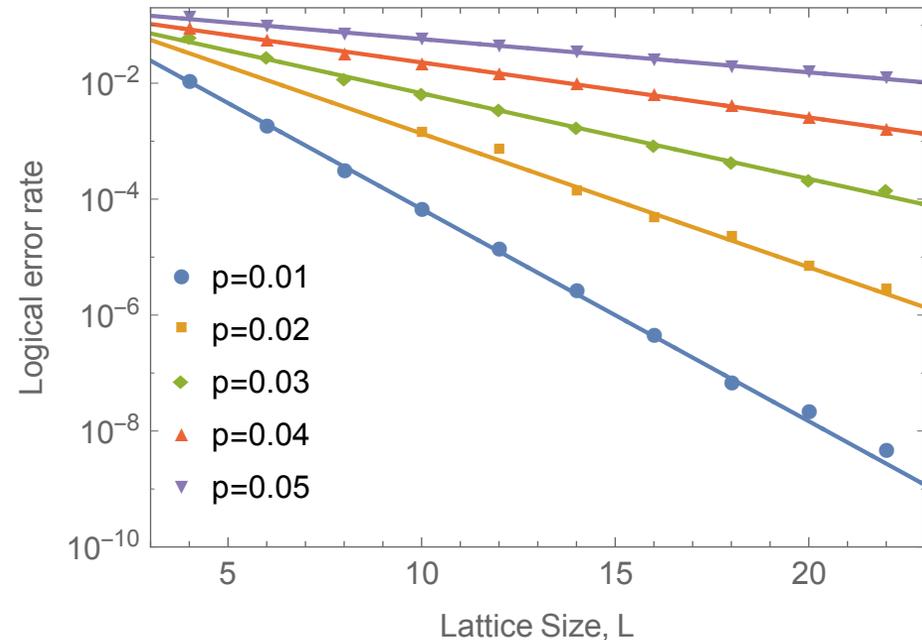
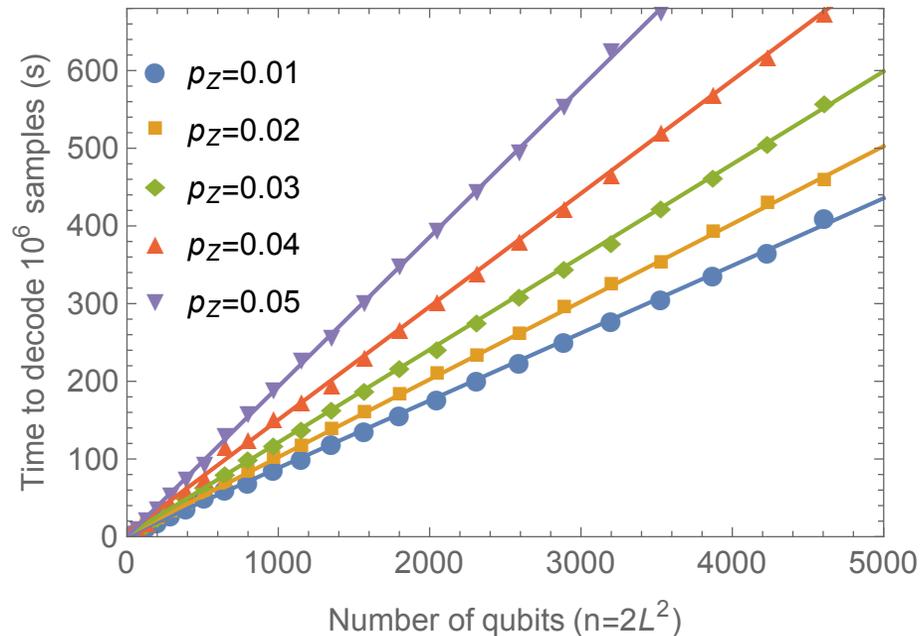
- Chains of errors are likely short (*triggered-vertices should be nearby*).
- Erasures that do not wrap around the torus do not cover logical errors (*therefore these can be corrected*).
- Errors are corrected up to a stabilizer (*so we can freely enlarge the erasure*).
- Erasure clusters containing an even number of triggered-checks support a solution entirely contained in erasure (*clusters can be solved separately*).

Delfosse, N., & Nickerson, N. H. (2021). Almost-linear time decoding algorithm for topological codes. *Quantum*, 5, 595.





# Some Numerical Results for the Union-Find Decoder

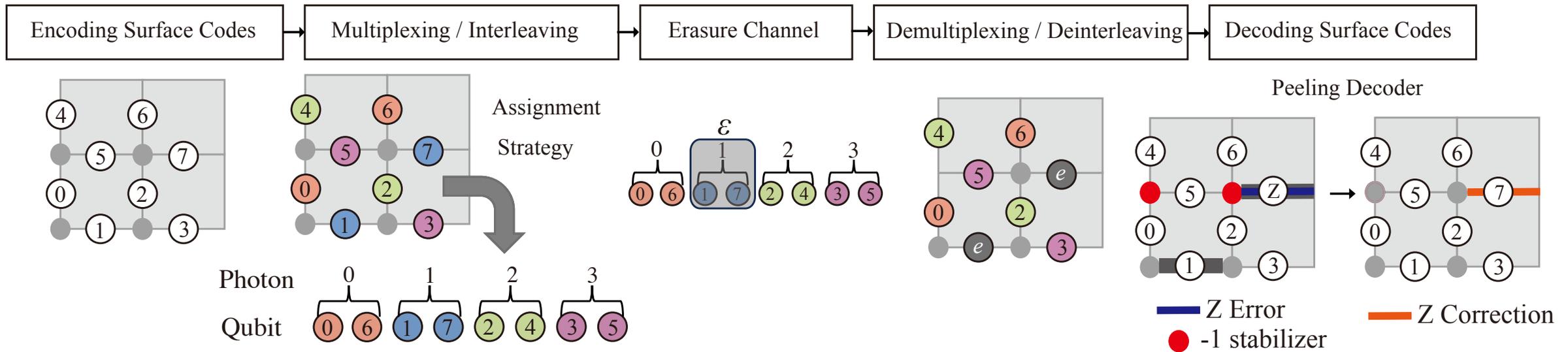


- The union-find decoder is (almost) linear time complexity in the code length.
- The union-find decoder is a close approximation of the maximum likelihood decoder.
- Increasing the torus lattice increases the performance of the decoder.
- Generalized version of the decoder exists for quantum LDPC codes.

Delfosse, N., & Nickerson, N. H. (2021). Almost-linear time decoding algorithm for topological codes. *Quantum*, 5, 595.



# Erasure Decoding Application: Multiplexed Quantum Communication

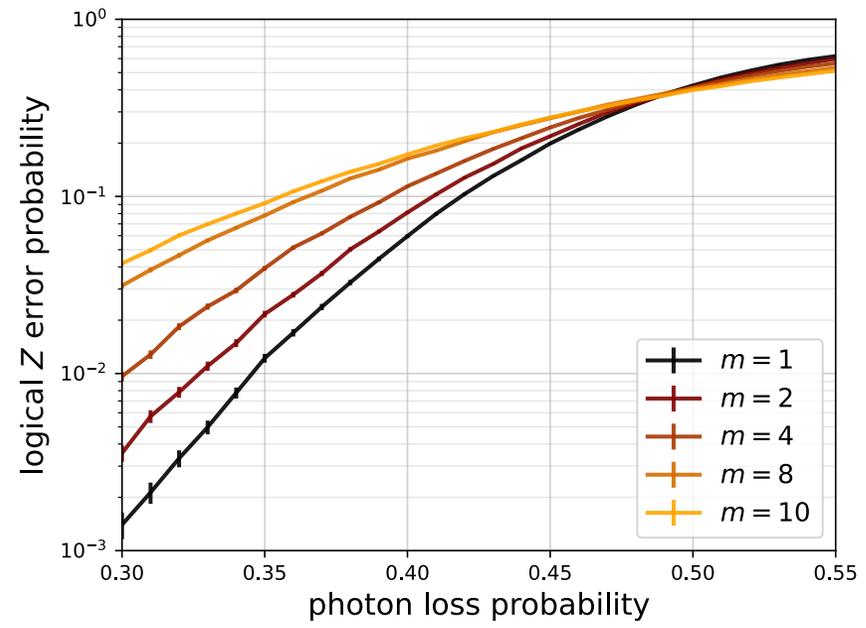


- This refers to a procedure wherein multiple qubits are encoded into a single photon.
- Loss of a single photon yields an erasure error on all encoded qubits.
- Code/decoder aware assignment strategies can mitigate the loss of information.

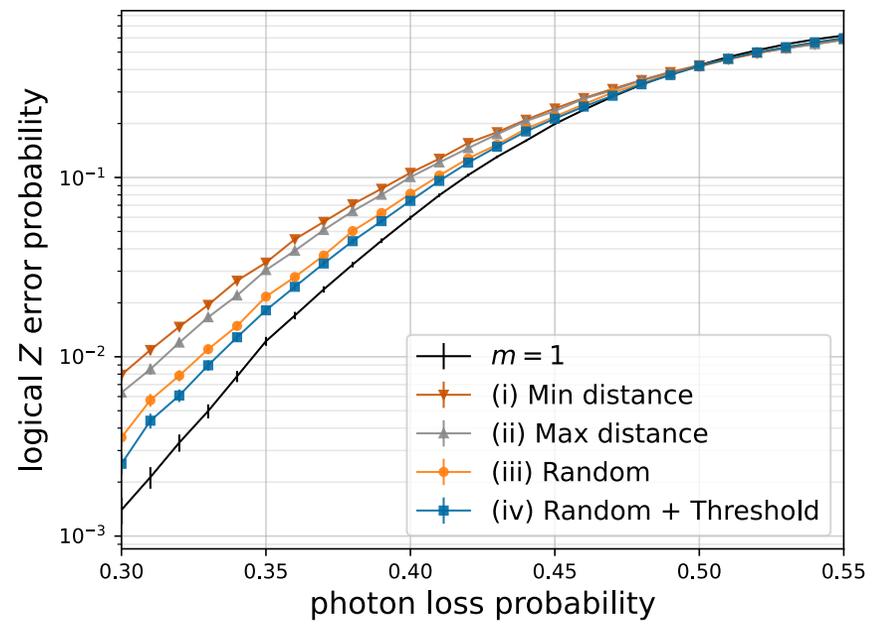


# Logical Error Rates for Multiplexed [200,10] Toric Code

Fixed assign. strategy (random),  
increasing  $m$  (qubits per photon)



Fixed  $m = 2$  qubits per photon,  
various assignment strategies



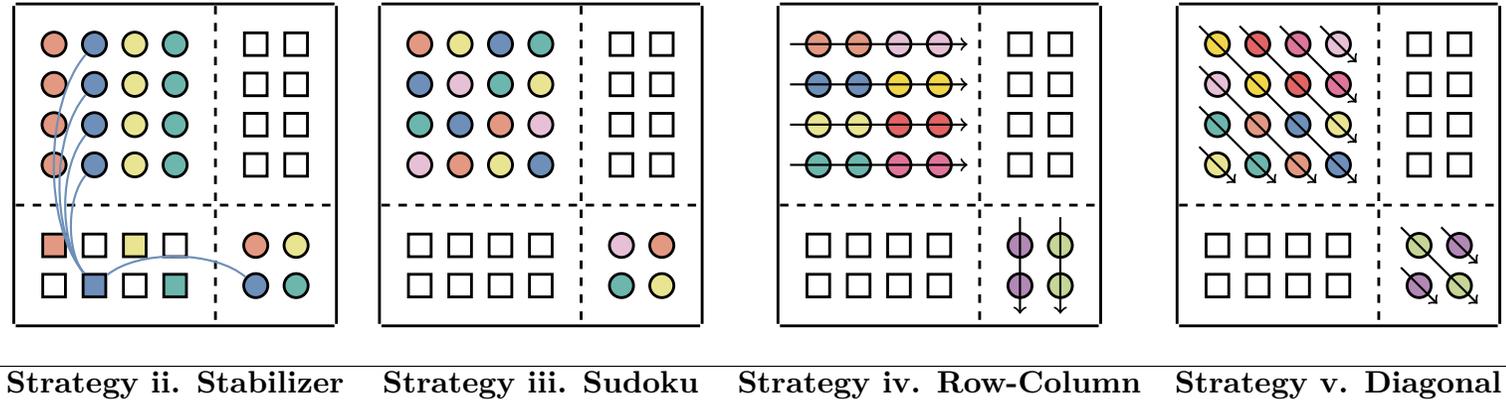
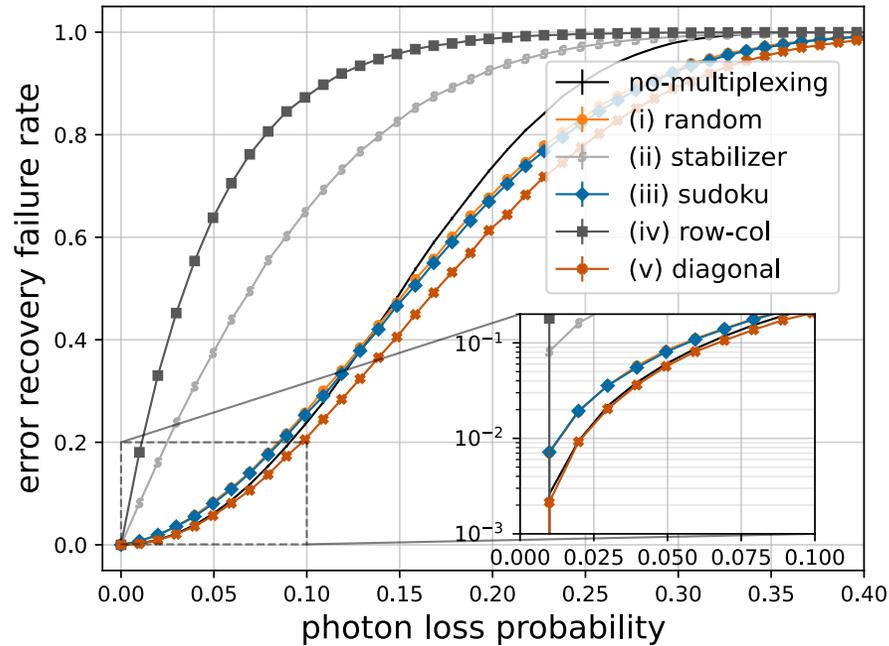
- Plots show erasure decoding (using a surface code spanning-tree) for [200,10] toric code.
- Increasing the number of encoded qubits per photon also increase the logical error rate.
- The choice of assignment strategy has a large effect on the decoding performance.

Nishio, S., Connolly, N., Piparo, N. L., Munro, W. J., Scruby, T. R., & Nemoto, K. (2025). Multiplexed quantum communication with surface and hypergraph product codes. *Quantum*, 9, 1613.



# Logical Error Rates for Multiplexed [320,80] HGP Code

$m = 8$  qubits per photon

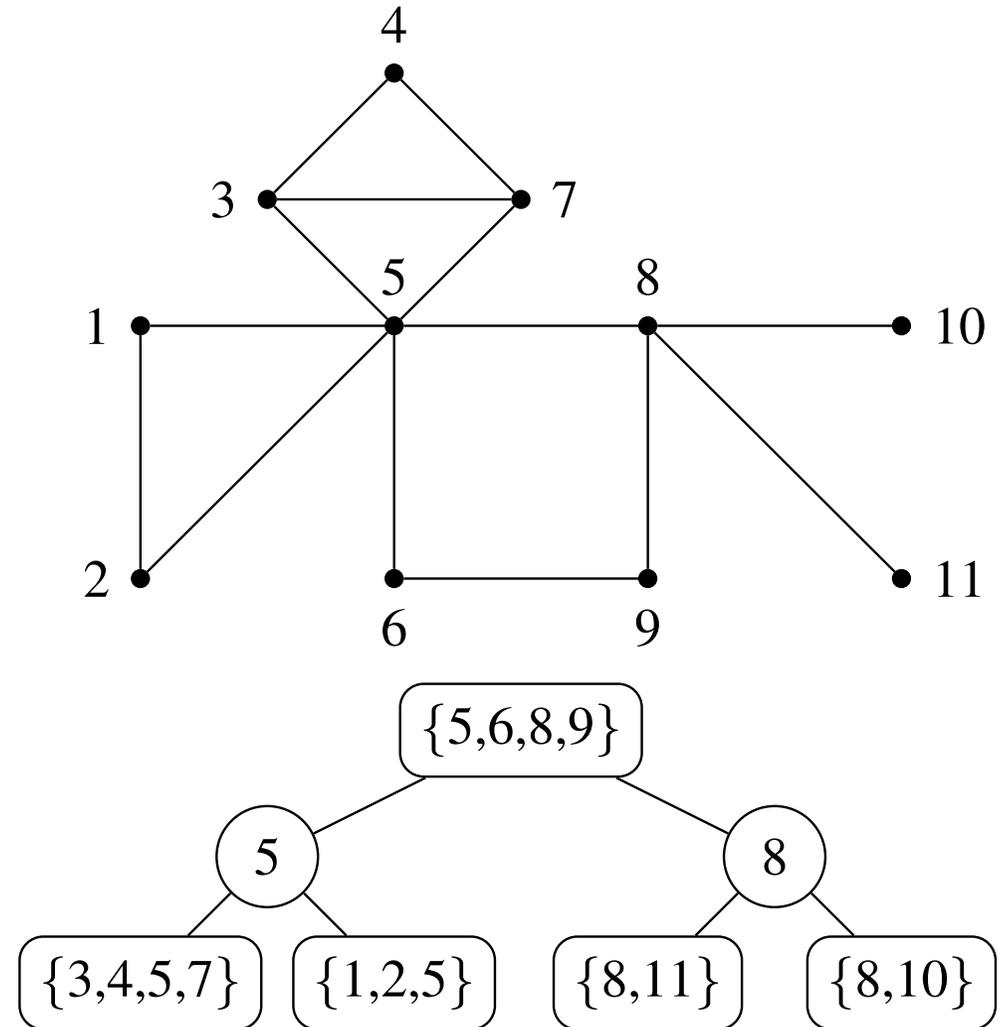


- Plots show erasure decoding using VH decoder for a [320,80] HGP code.
- Decoder-aware assignment strategies have a significant effect on performance.
- Certain strategies adapted to the decoder match the no-multiplexing case!



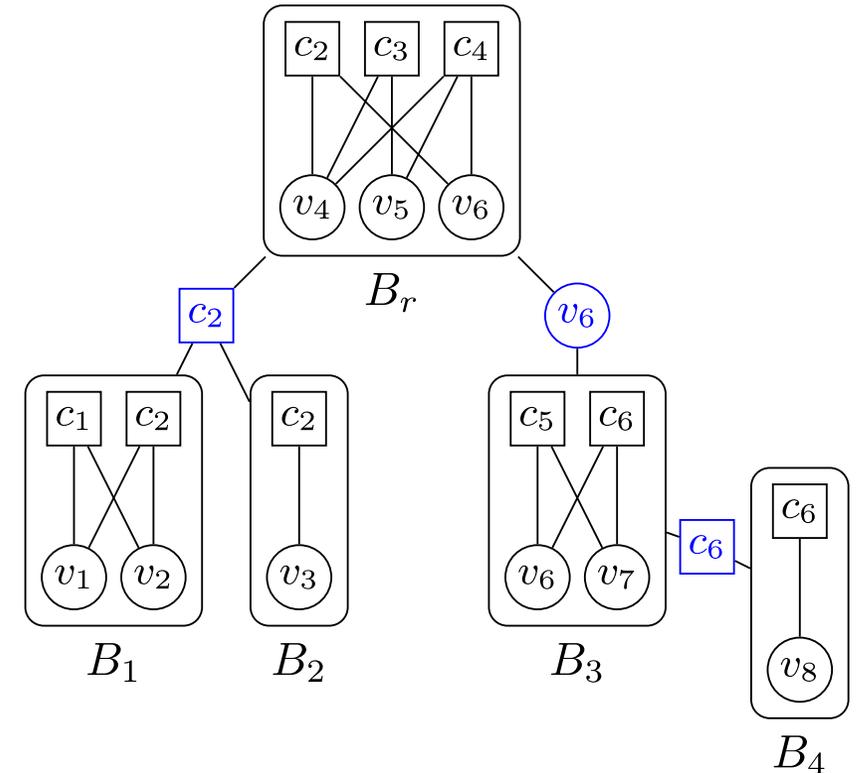
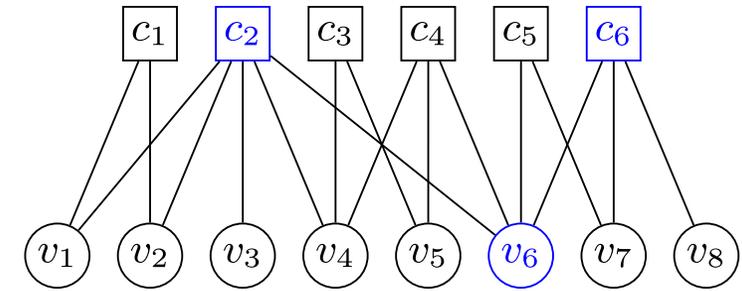
# Generalizing the VH-Decoder: Cluster Decompositions

- The VH-Decoder has certain limitations.
  - Only defined for HGP codes.
  - Quadratic complexity in code length.
  - Susceptible to stopping sets.
  - Does not close ML gap at higher erasures.
- The Cluster Decoder uses a similar approach to post process peeling decoder stopping sets.
  - Defined for all quantum LDPC codes.
  - Variable complexity (linear to quadratic).
  - Resolves all\* stopping sets.
  - Near ML performance (similar to VH).
- The cluster decoder relies on decomposing the Tanner graph using cluster trees.



# Cluster Decoder for Quantum LDPC Codes

1. The cluster decoder applies peeling until stuck.
2. A peeling decoder stopping set gives rise to an erasure-induced subgraph of the Tanner graph.
3. This subgraph is decomposed as a cluster tree.
4. Clusters can be solved via Gaussian elimination.
5. Certain constraints on clusters determine order.



## Algorithm 2: RecursiveCompute

```

Input: Cluster  $B$ , residual syndrome  $s'_x$ 
1  $L \leftarrow$  list of additional constraints
  // Collect constraints, if any
2 for  $v_i$  in the child variable cut nodes of  $B$  do
3   for  $B'$  in the child clusters of  $v_i$  do
4     RecursiveCompute( $B'$ ,  $s'_x$ )
5   if exist a frozen child cluster  $B'$  then
6     add  $v_i(B) = v_i(B')$  to  $L$ 
7 for  $c_j$  in the child check cut nodes of  $B$  do
8   for  $B'$  in the child clusters of  $c_j$  do
9     RecursiveCompute( $B'$ ,  $s'_x$ )
10  if all child clusters  $B_1, \dots, B_s$  are frozen then
11    add  $c_j(B) = (s'_x)_j - c_j(B_1) - \dots - c_j(B_s) \bmod 2$  to  $L$ 
  // Compute cluster solutions
12 if  $B$  is not a root cluster then
13    $n \leftarrow$  parent cut node of  $B$ 
14   Compute and store two solutions of  $B$  with  $L$ , one
  with  $n(B) = 0$ , and the other with  $n(B) = 1$ 
15   if both solutions exist then
16      $B$  labeled free for parent  $n$ 
17   else
18      $B$  labeled frozen for parent  $n$ 
19 else
20   Compute one solution of  $B$  with  $L$ 
  
```

## Algorithm 3: RecursiveSelect

```

Input: Cluster  $B$  with parent cut node  $n$ , constraint
 $n(B) = b$ , residual syndrome  $s'_x$ 
  // Select a cluster solution
1 if  $B$  is frozen or it is the root cluster then
2    $B$  has only one solution to select from
3 else
4    $B$  has two stored solutions; select the one consistent
  with  $n(B) = b$ 
  // Propagate constraints
5 for  $v_i$  in the child variable cut nodes of  $B$  do
6   for  $B'$  in the child clusters of  $v_i$  do
7     RecursiveSelect( $B'$ ,  $v_i(B') = v_i(B)$ ,  $s'_x$ )
8 for  $c_j$  in the child check cut nodes of  $B$  do
9    $B_1^*, \dots, B_s^* \leftarrow$  frozen child clusters of  $c_j$ 
10   $B_1, \dots, B_t \leftarrow$  free child clusters of  $c_j$ 
  Compute
11   $\Delta s_j = (s'_x)_j - c_j(B) - c_j(B_1^*) - \dots - c_j(B_s^*) \bmod 2$ 
  // Frozen child clusters
12  for  $B'$  in  $\{B_1^*, \dots, B_s^*\}$  do
13    RecursiveSelect( $B'$ ,  $c_j(B')$  is frozen,  $s'_x$ )
  // Free child clusters
14  RecursiveSelect( $B_1$ ,  $c_j(B_1) = \Delta s_j$ ,  $s'_x$ )
15  for  $B'$  in  $\{B_2, \dots, B_t\}$  do
16    RecursiveSelect( $B'$ ,  $c_j(B') = 0$ ,  $s'_x$ )
  
```

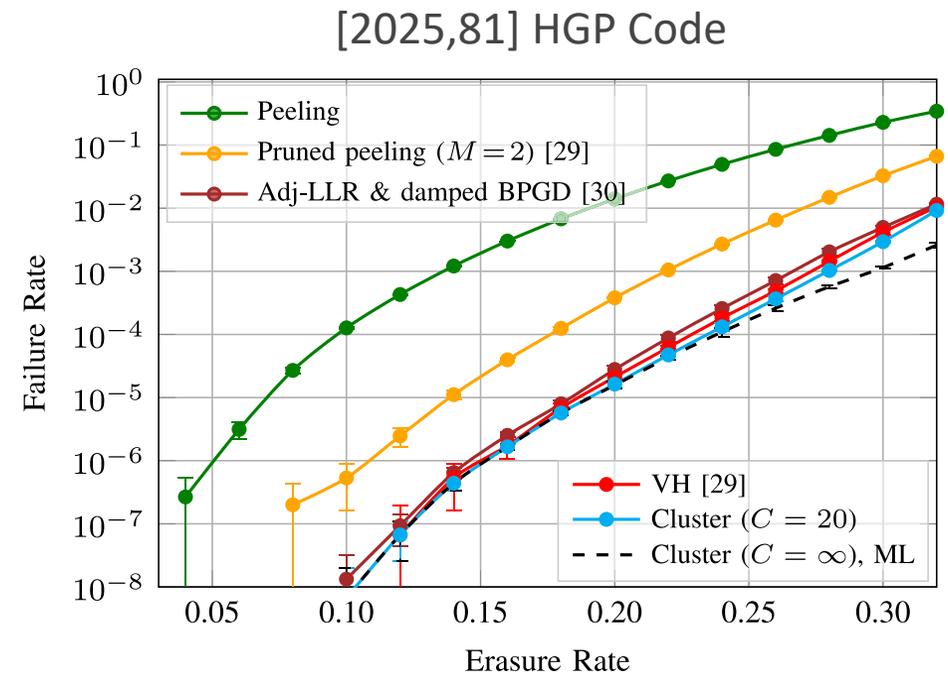
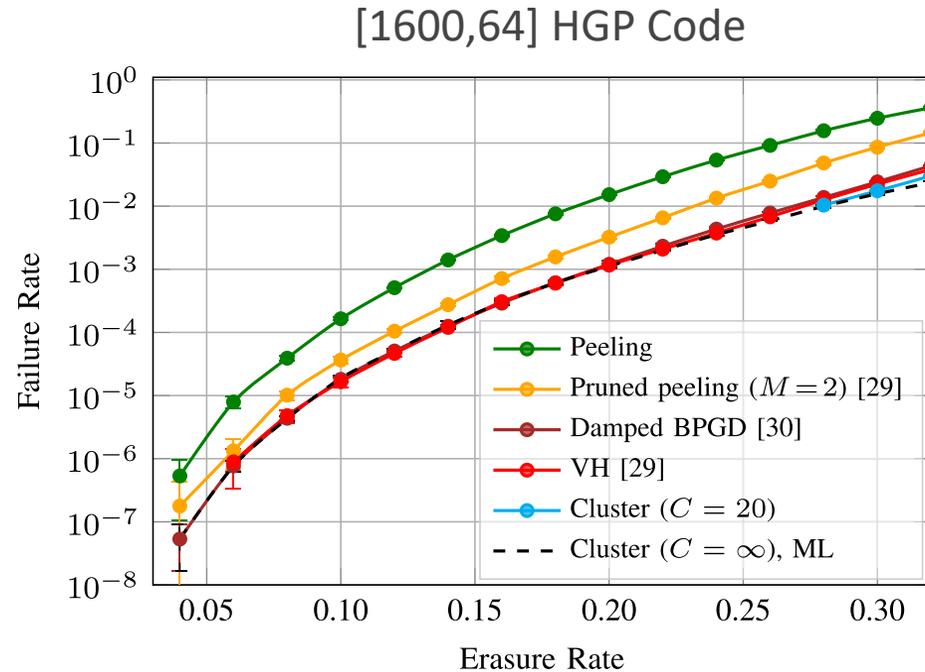
## Algorithm 4: Cluster Decomposition Post-Processing

```

Input: block length  $n$ , residual Tanner graph  $\mathcal{G}'$ , residual
syndrome  $s'_x$ 
Output:  $\tilde{x}$ 
  // Cluster decomposition
1 Decompose  $\mathcal{G}'$  into a cluster forest with
  Hopcroft-Tarjan's algorithm
  // Construct cluster solutions
2 for each cluster tree in the forest do
3    $B_r \leftarrow$  root cluster
4   RecursiveCompute( $B_r$ ,  $s'_x$ )
5   RecursiveSelect( $B_r$ ,  $s'_x$ )
6 Merge cluster solutions into a global solution  $\tilde{x}$ 
7 return  $\tilde{x}$ 
  
```



# Some Numerical Results for the Cluster Decoder



- Plots show a comparison of erasure decoders for two HGP codes.
- Cluster decoder with *constrained* size outperforms VH (linear complexity).
- Cluster decoder with *unconstrained* size achieves ML (quadratic complexity).



**Thank you!**