

# Quasilinear Time Decoding Algorithm for Topological Codes with High Error Threshold

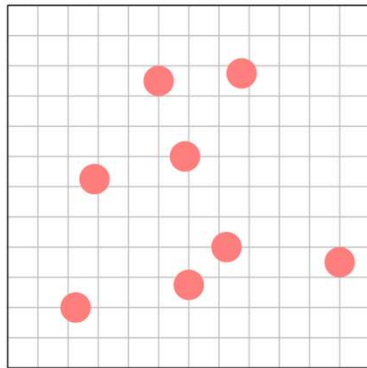
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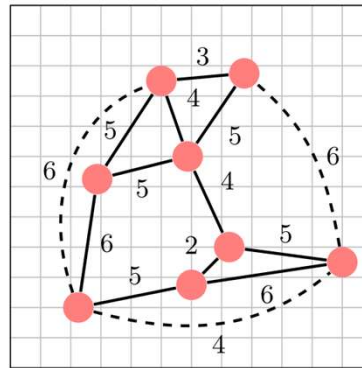
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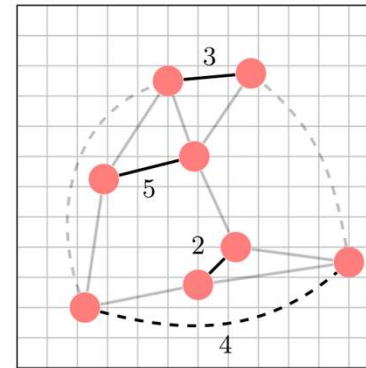
# Minimum-Weight Perfect Matching decoder



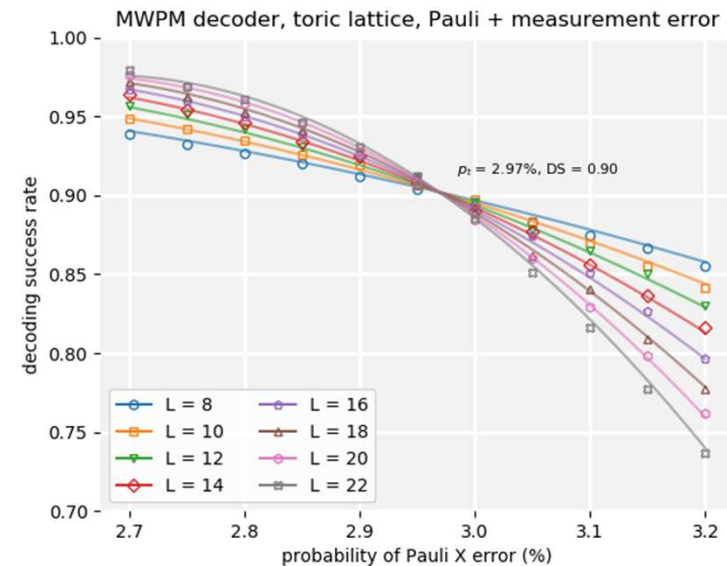
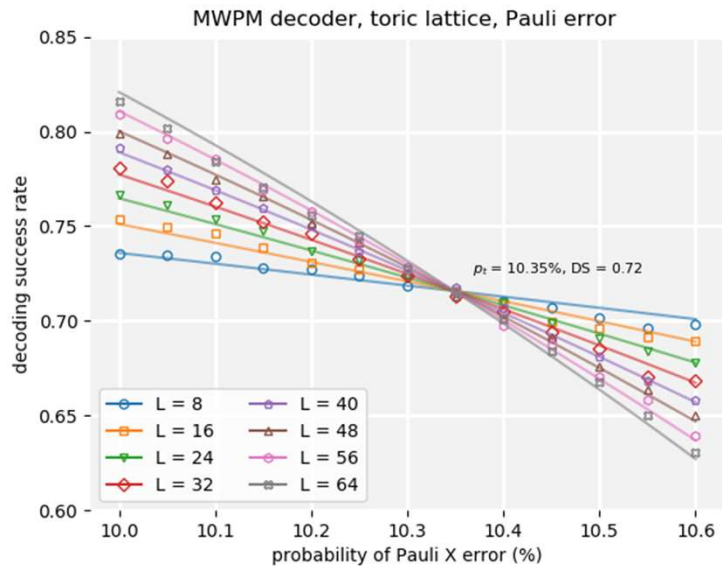
Measured syndrome



Completely connected graph with weights



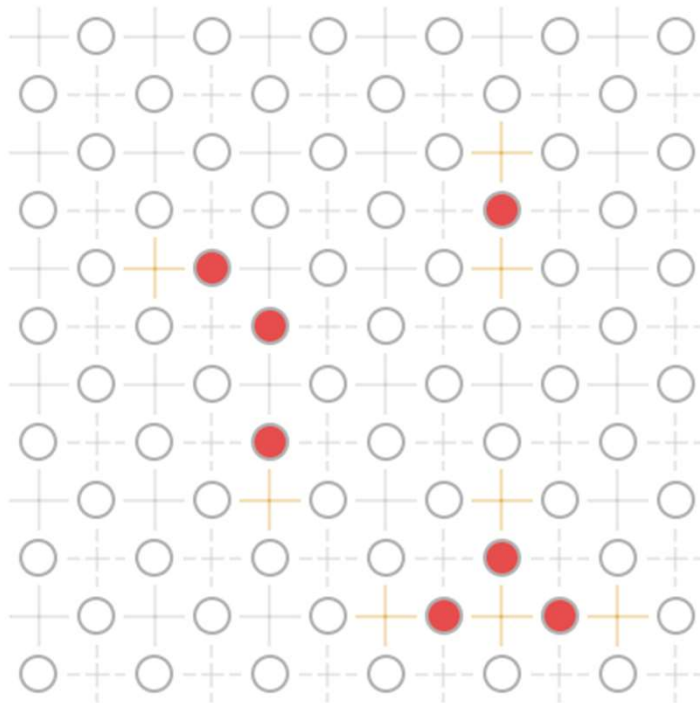
Minimum weight subset of edges



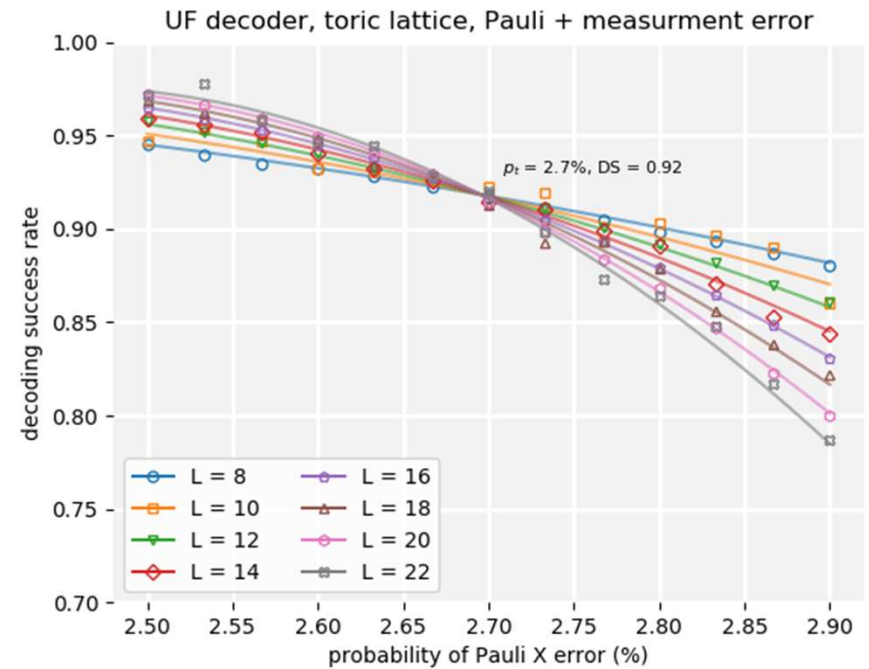
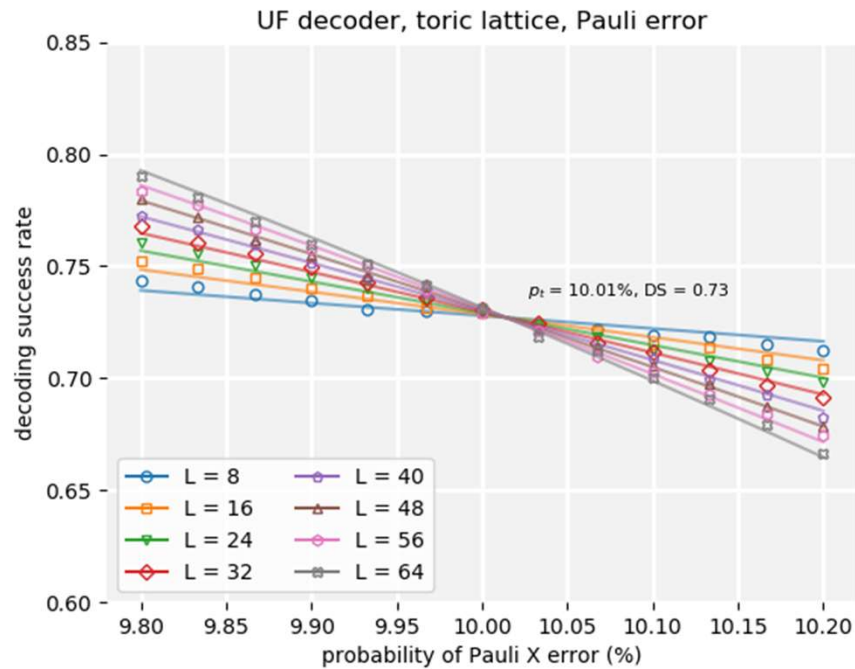
Worst case time complexity  $\mathcal{O}(n^2\sqrt{n})$

# Union-Find decoder

- Nontrivial syndrome: odd-parity *cluster*
- Grow odd-parity clusters in size until merged with other odd-parity cluster
- Apply weighted growth: order cluster growth by size
- Tree by DFS
- Peel cluster-trees



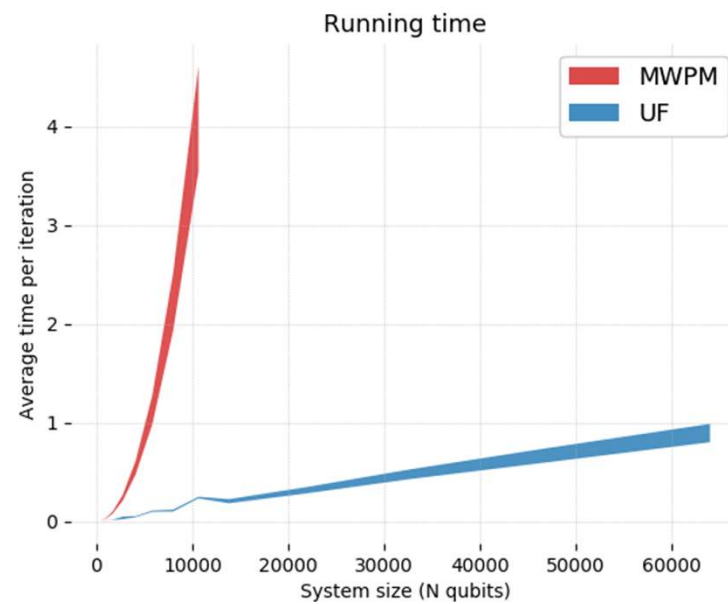
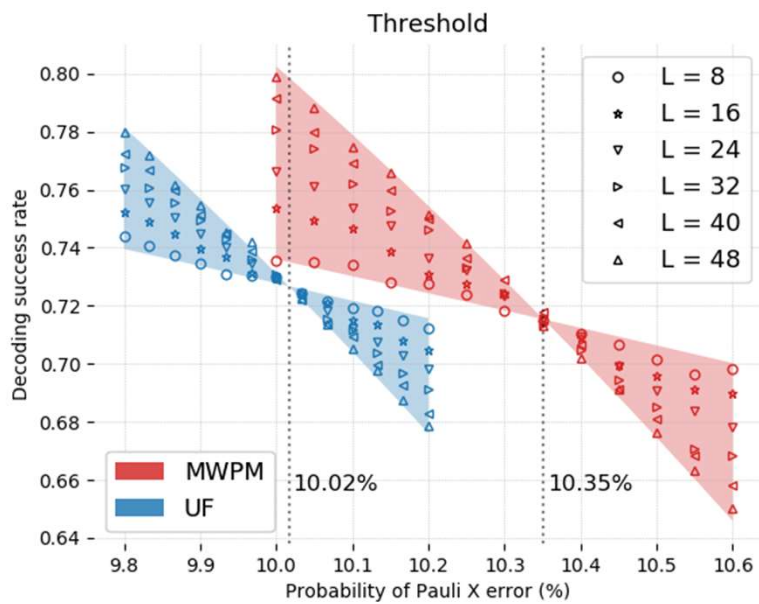
# Union-Find decoder performance



- Reported thresholds
  - toric 2D: 9.2% (weighted 9.9%)
  - toric 3D: 2.4% (weighted 2.6%)

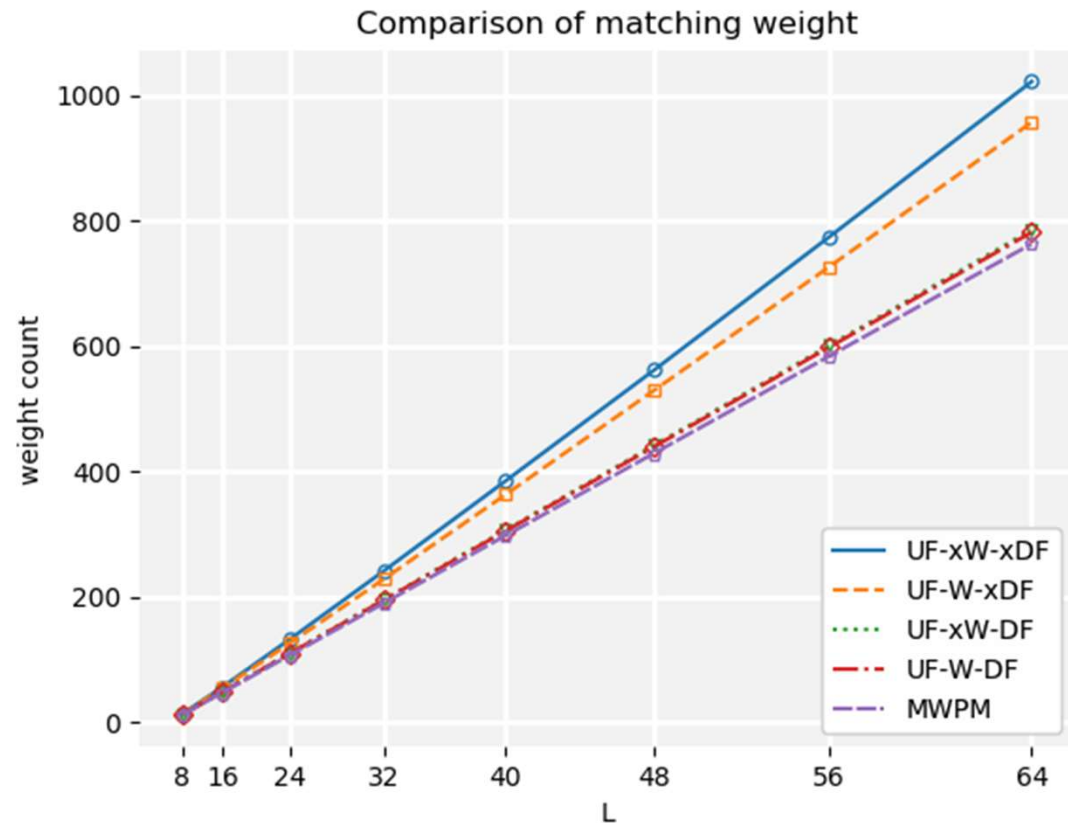
# Decoders

Decoder	2D toric threshold	3D toric threshold	Complexity
MWPM decoder	10.3% 10.35%	2.9% 2.97%	$\mathcal{O}(n^2\sqrt{n})$
UF decoder	9.9% 10.01%	2.6% 2.70%	$\mathcal{O}(n\alpha(n))$



# Matching weight heuristic

Decoder	Threshold
UF-xW-xDF	9.71%
UF-xW-DF	9.79%
UF-W-xDF	9.98%
UF-W-DF	10.01%
MWPM	10.35%



Intuition that lower matching weight is a heuristic for increased threshold

# Dynamic forests during growth

1. Grow cluster graph
2. Make cluster tree
3. Peel tree



1. Grow cluster tree
2. Peel tree

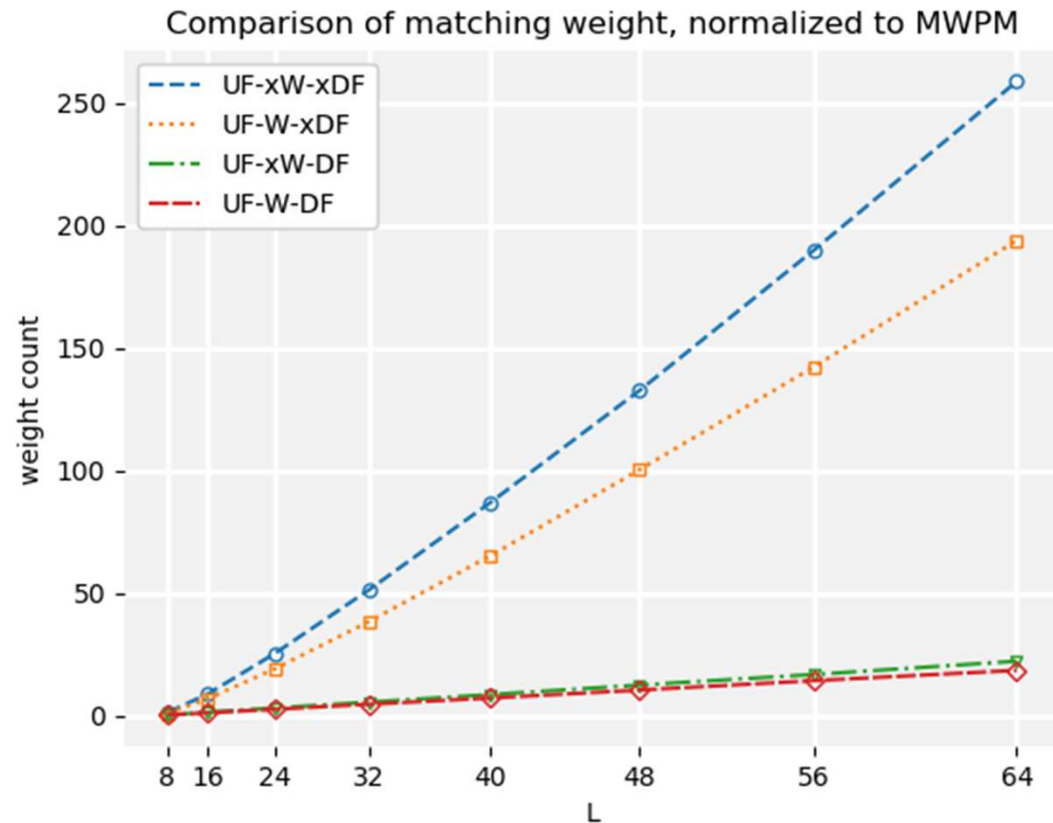


Dynamic forest equivalent to parallel breadth-first searches from the syndromes



# Matching weight heuristic

Decoder	Threshold
UF-xW-xDF	9.71%
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UF-W-xDF	9.98%
UF-W-DF	10.01%
MWPM	10.35%



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# Decoders

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# Union-Find Balanced-Bloom decoder

- Potential matching weight
- Data structure: node trees
- Node delays
- Calculation
- Performance

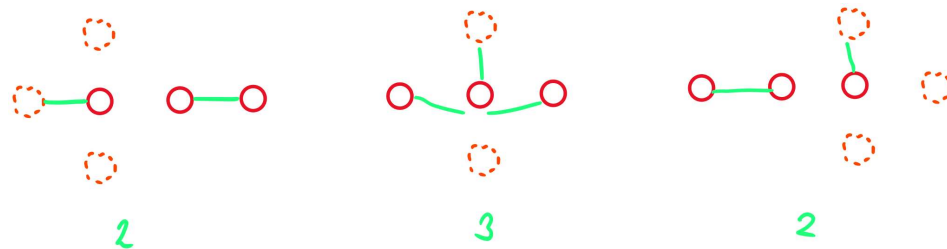
# Potential matching weight

- Cluster  $C$  is a graph  $C(\mathcal{E}, \mathcal{V})$

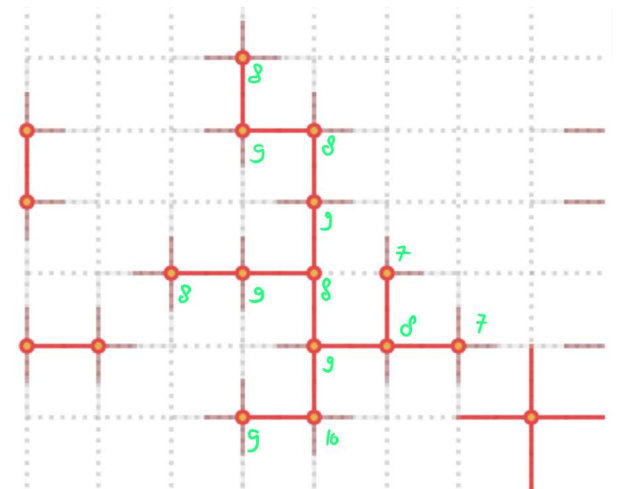


- $PMW(v \in \mathcal{V}, C)$

*The matching weight of edges in  $E$  after a hypothetical union of  $C$  with another cluster on an edge supported by  $v$ .*



- Minimize weight by prioritizing growth
- Vertex specific
- Local variable



# Node tree data structure

- node  $n$  represents a subset of vertices of a cluster  $C$   
 $\mathcal{V}_n \subseteq \mathcal{V}$  for which the vertices are *seeded* in the same vertex  $v_{seed}$ .
- Let a cluster be additionally represented by a set of nodes  $\mathcal{N} = \{n_1, n_2, \dots\}$ .



- Boundary vertices in the same node have equal PMW.
- Calculation of PMW reduced to the node tree
- Prioritize node specific growth with low PMW

# Node delays

## Bloom of a node:

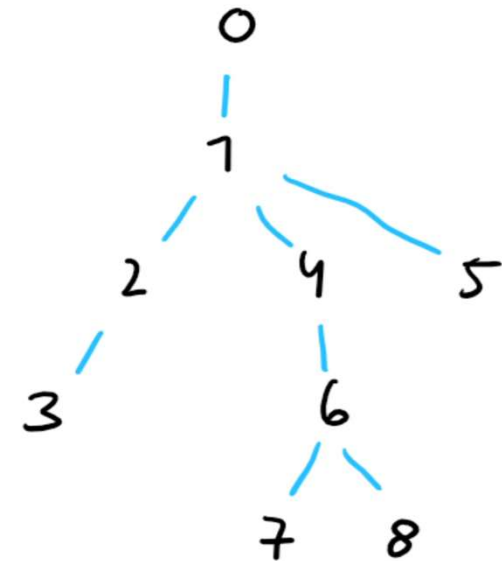
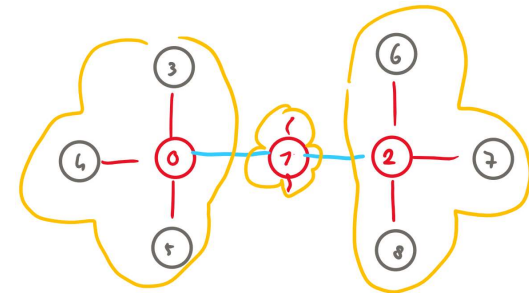
Growing the boundaries belonging to a node  $n$

## Delayed bloom:

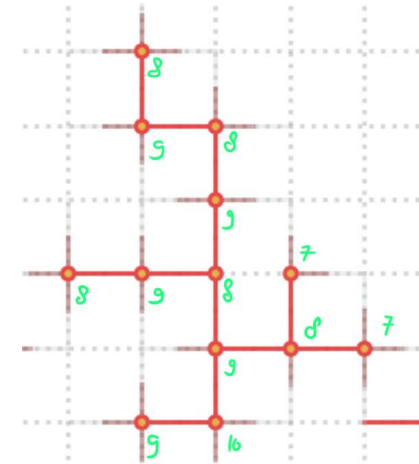
To suspend the bloom of a node for # iterations until an *equilibrium* of PMW is reached in the cluster

→ **Balanced Bloom**

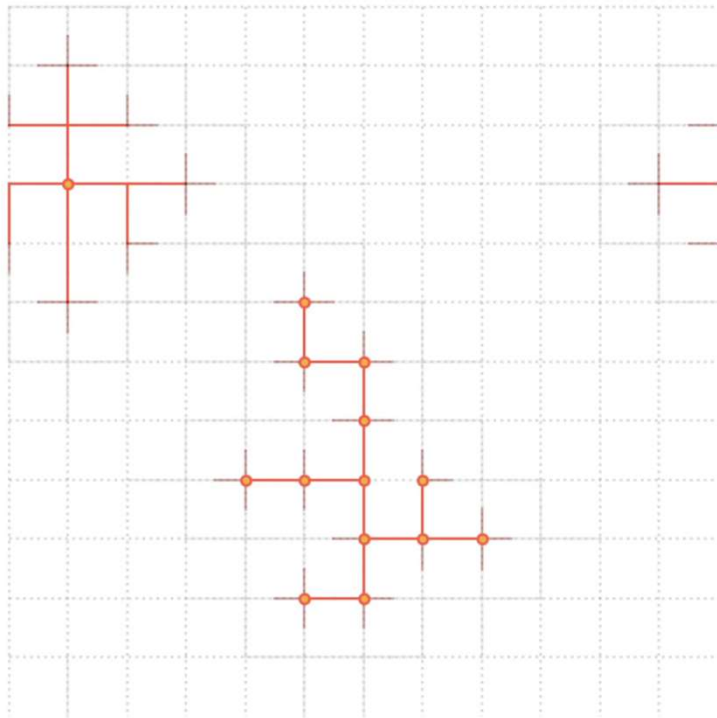
- Delay is calculated via DFS of the node tree
- $Delay(n_i) = f(n_i, n_{i-1})$



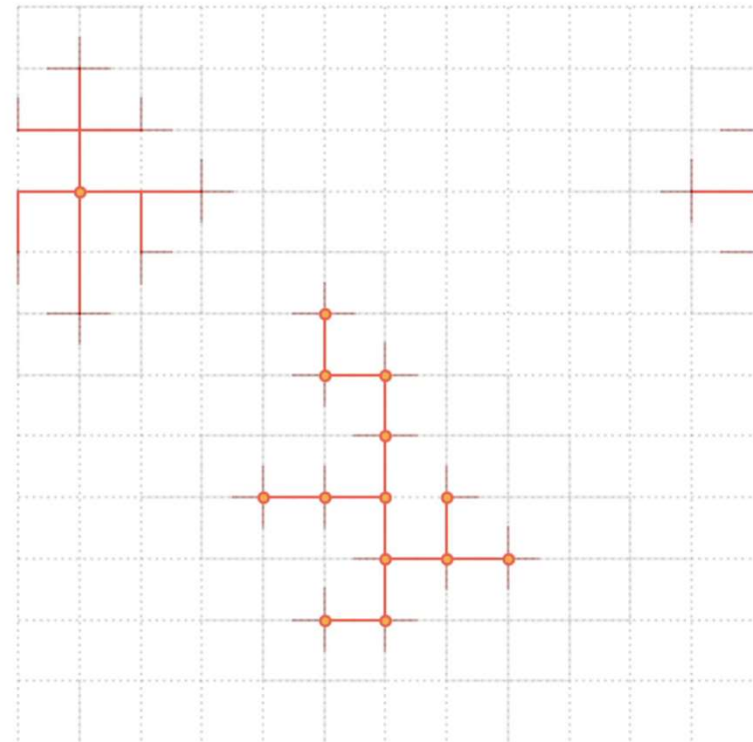
# Comparison



Weighed Union-Find

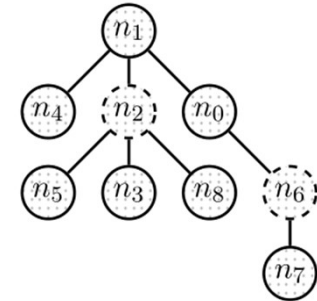
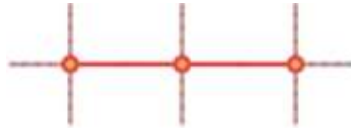


Union-Find Balanced-Bloom



# Node delay calculation

$n.p$  parity



$n.d$  delay difference in PMW compared with root

$n.r$  radius number of blooms

$n.g$   $n.r \bmod 2$

$$n_{\beta}.p = \begin{cases} 0, & \text{if } n_{\beta} \text{ has no children} \\ (\sum_j 1 - n_{\gamma,j}.p) \bmod 2 \mid n_{\gamma} \text{ child of } n_{\beta}, & n_{\beta} \equiv s_{\beta} \\ 1 - (\sum_j 1 - n_{\gamma,j}.p) \bmod 2 \mid n_{\gamma} \text{ child of } n_{\beta}, & n_{\beta} \equiv l_{\beta} \end{cases}$$

$$n_{\beta}.d = n_{\alpha}.d + \left[ \left( \left\lfloor \frac{(n_{\beta}.r + n_{\beta}.g)}{2} \right\rfloor - \left\lfloor \frac{(n_{\alpha}.r + n_{\beta}.g)}{2} \right\rfloor + (-1)^{n_{\beta}.p+1}(n_{\alpha}, n_{\beta}) \right) - (n_{\beta}.g + n_{\alpha}.g) \bmod 2 \right] \mid n_r.d = 0, n_{\beta} \text{ child of } n_{\alpha}$$



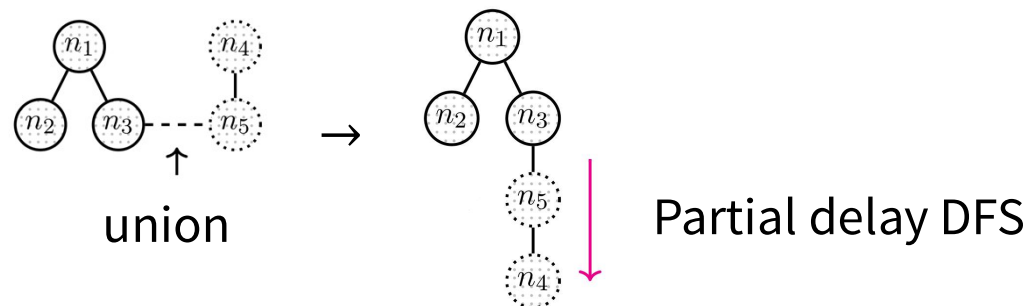
# Node tree unions

After union, tree structure changes: recalculate delay

- Union of odd/odd clusters → even cluster, no PMW
- Union of even/even clusters → even cluster, no PMW
- Union of **odd**/**even** clusters → **odd** cluster

## Delay preservation union:

*Preserve calculated delays in **odd** cluster by pointing merging node of the **even** cluster to the **odd** cluster.*

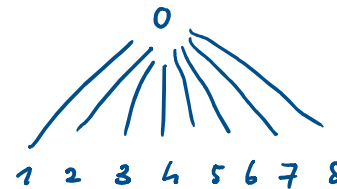
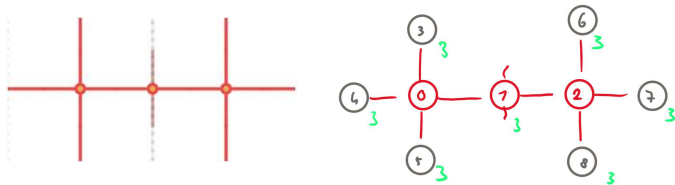
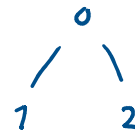


Worst case complexity  $\mathcal{O}(n \log n)$

# Relevant data structures

Union-Find  
Vertex tree  $\mathcal{V}$

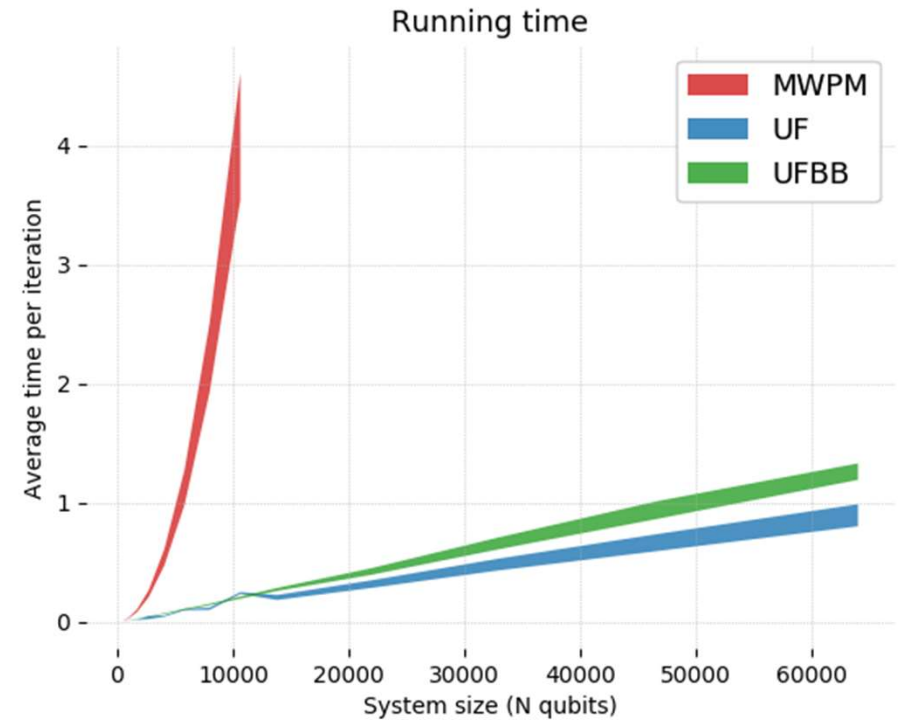
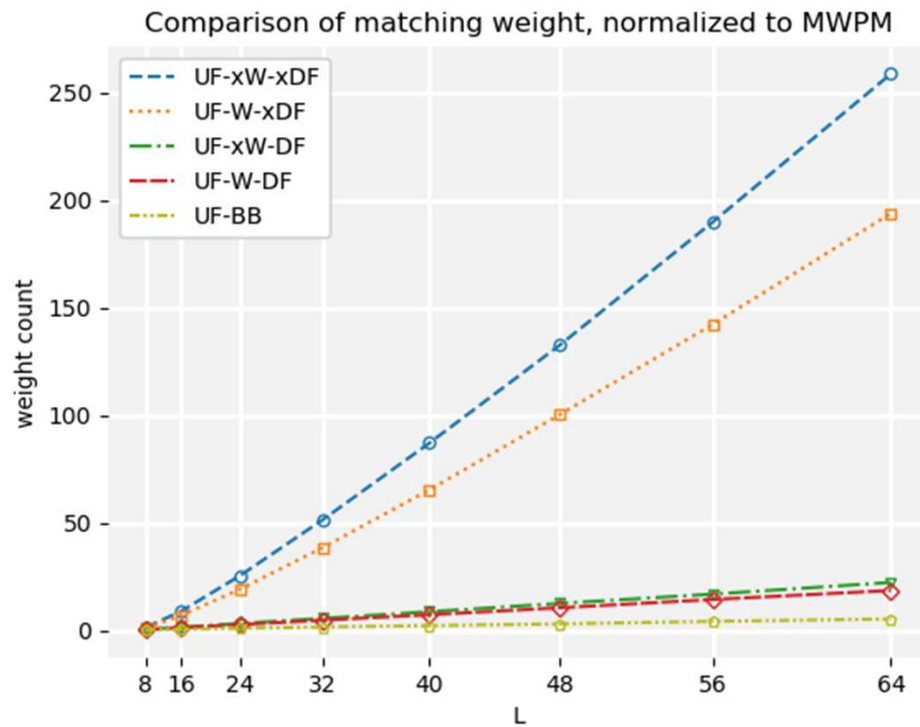
Node tree  $\mathcal{N}$



Function	Cluster identification	Potential matching weight
Tree structure	Edges are parent pointers	Reduced graph of cluster
Tree deformation	Path compression	No
Tree merge	Weighted union	Node tree union

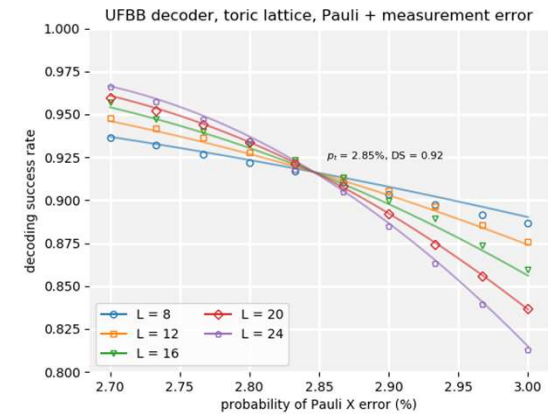
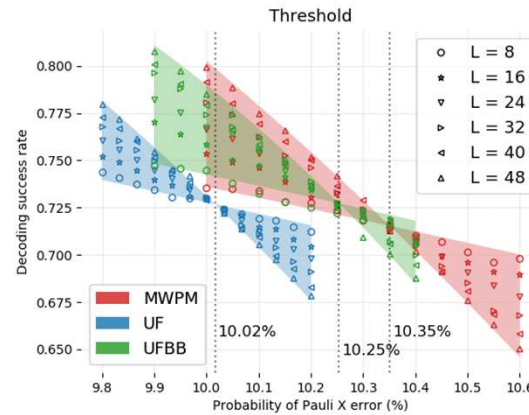
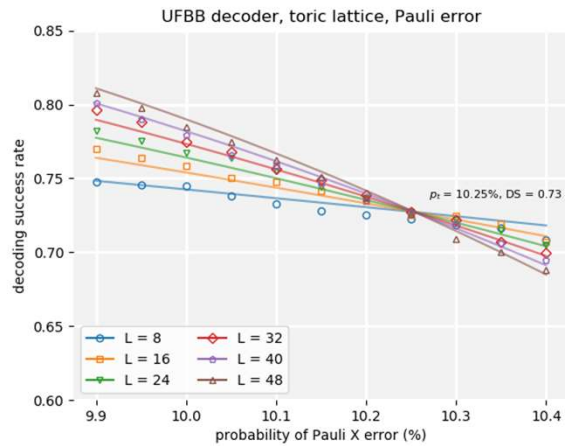
Worst case complexity  $\mathcal{O}(n \log n)$

# UF-BB performance

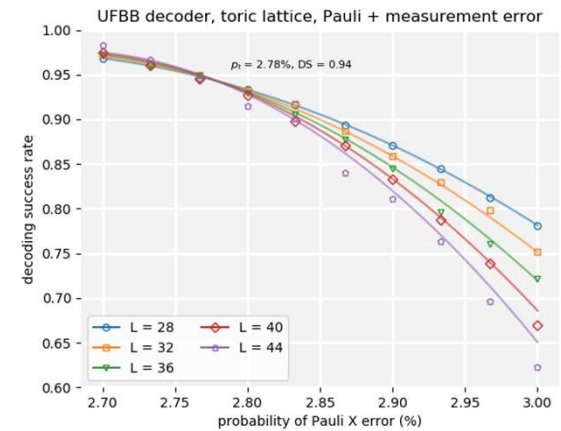
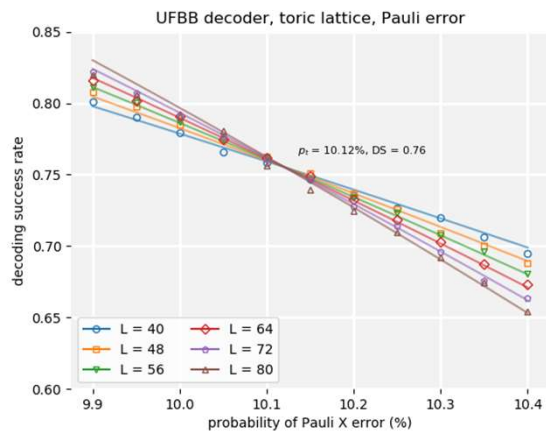


# UF-BB threshold

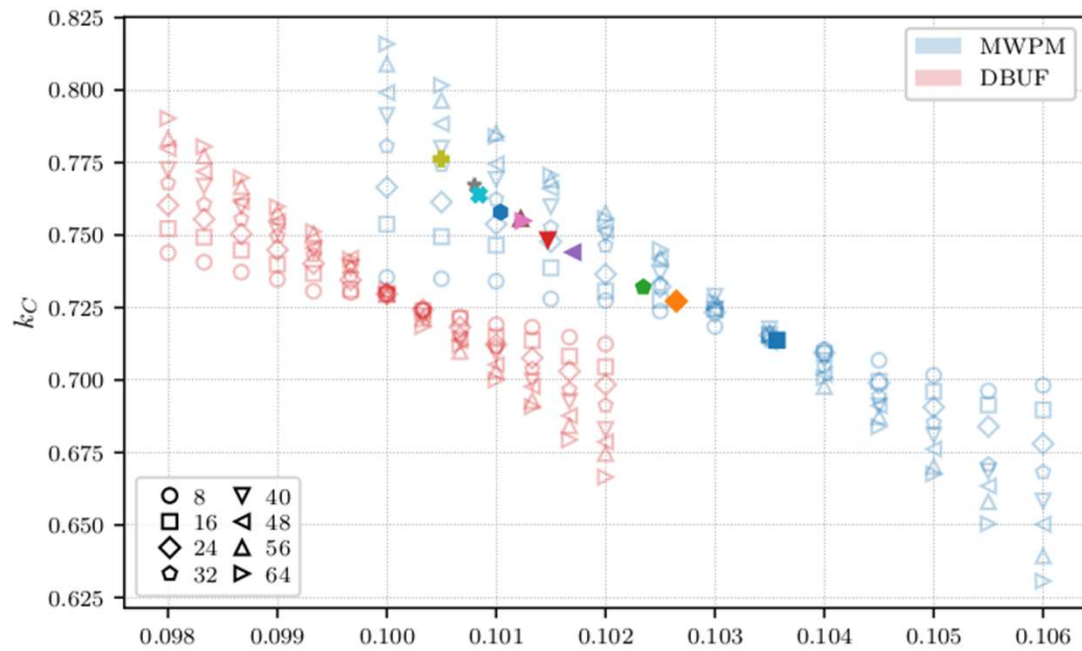
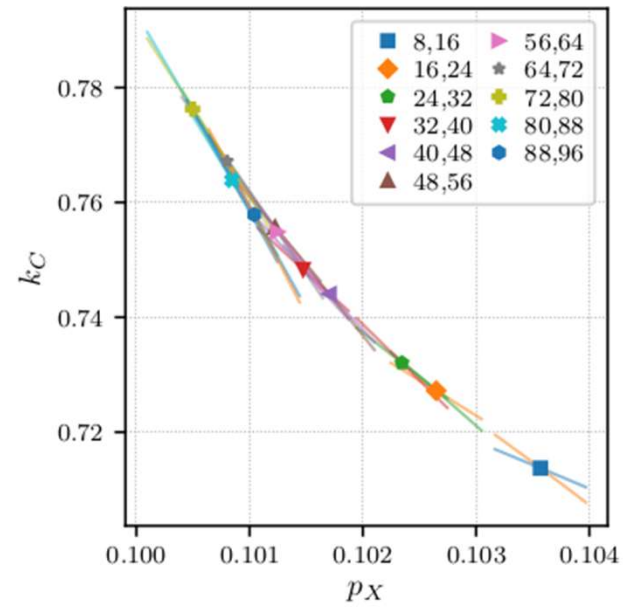
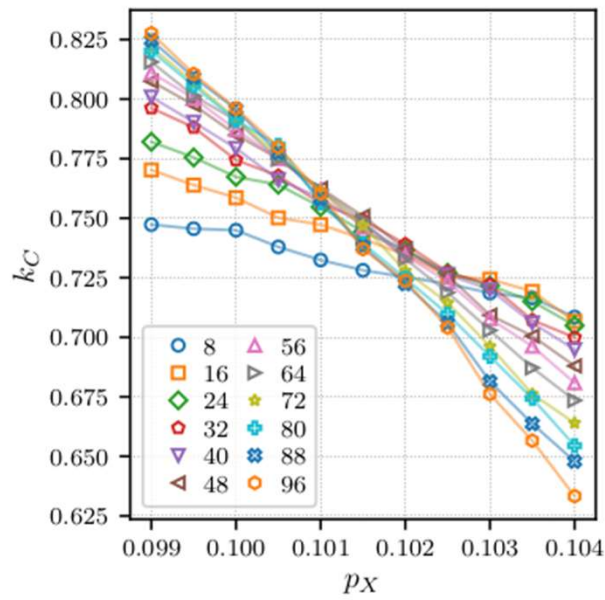
Investigate *small* lattice sizes



Investigate *bigger* lattice sizes



# UF-BB threshold



# Conclusions

- The performance of the UF-BB decoder is better than vanilla UF decoder for all lattice sizes and comparable to MWPM for small and medium lattice sizes with quasilinear complexity
- Lower matching weight is a heuristic for increased threshold

Code used for simulation, visualization can be found at [https://github.com/watermarkhu/oop\\_surface\\_code](https://github.com/watermarkhu/oop_surface_code)