Near-Optimal Distributed Implementations of Dynamic Algorithms for Symmetry-Breaking Problems

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Example Sizes of Publicly Available Datasets

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Large Graphs Too Expensive to Rerun Even Linear Time Static Algorithms After Updates



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Graphs Topology Dynamically Changing with Edge Insertions and Deletions

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Nodes Can Choose to Send to Some/All Neighbors

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Nodes Use Multiple Rounds of Communication to Send Messages



Each Round Nodes Can Send to Same or Different Neighbors







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Determining Number of Edges After Insertions and Deletions

m = 16



Many Centralized Algorithms use **Global Restarts** (Large Part of Graph Restarts)



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Solution: Consider Partial Local Neighborhood

Local Neighborhood: reduces round complexity

Partial Neighborhood: reduces message complexity

Classic Symmetry-Breaking Problems

- $(\Delta + 1)$ -Coloring
- Maximal Matching and 3/2-Approximate Maximum Matching
- Maximal Independent Set

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Grand Prize:

- message complexity matches update time of best-known sequential, centralized algorithm
- round complexity is O(1)

Our Deterministic Algorithm Results

$(\Delta + 1)$ -Vertex Coloring

- $O(\sqrt{m})$ messages and O(1) rounds, both worst-case
- Dynamic Edge Orientation Technique
- Matches best-known sequential, centralized algorithm of [KNNP20]

3/2)-Maximum Matching

- $O(\sqrt{m})$ amortized messages and $O(\log \Delta)$ rounds, worst case
- High-Degree/Low-Degree Partitioning Using Surrogates
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Maximal Matching

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<u>Maximal Independent Set</u>

- O(m^{2/3} log² n) messages and
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- High-Degree/Low-Degree Partitioning Using 6-Hop Neighborhood
- Use a small-diameter *static* algorithm to obtain MIS in high-degree and *dynamic* MIS for low-degree
- Matches best-known sequential, centralized [GK21] up to $\tilde{O}(1)$ factor



No two adjacent nodes have same color

Uses at most $(\Delta + 1)$ colors

Edge Insertions May Result in Conflicts



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- Reset counter $p_v \leftarrow \deg(v)$
- Repeat under future updates

Invariant: at most $4\sqrt{m}$ outgoing



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- Message complexity: *O*(1) amortized

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- Round complexity: *O*(1) worst-case
- Message complexity: 0(1) amortized
 - O(1) worst-case
 - Gradually 20 reorientations per update for the next $p_v/10$ updates

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• Hard case: edge insertions



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- Ask outgoing neighbors their colors
- Arbitrarily pick vertex recolor
- Send new color to outgoing

- Correctness: *u* knows all neighbor colors
 - Can pick free color



u recolors itself

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- Correctness: u knows all neighbor colors
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Each vertex matched to at most one neighbor

Edge Insertions and Deletions May Violating Matching Maximality



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• Easy case: edge insertions



- Easy case: edge insertions
 - Orient edges as needed



- Easy case: edge insertions
 - Orient edges as needed
 - Match if both endpoints not matched

Invariant: at most $4\sqrt{m}$ outgoing



• Harder case: edge deletions



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(3/2)-Approximation of Maximum Matching



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Maximum matching increased by 1

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Sequential, Centralized Dynamic (3/2)-Maximum Matching

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• Key Idea: **Degree doubling** to find augmenting paths



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- On update, search neighbors for free vertex or surrogate
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v searches 1 neighbor

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x does not have degree 1

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v searches two additional neighbors

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u has a mate u' with degree $\leq \sqrt{2}$



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 Match with neighbor if surrogate found

v matches with u

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- Match with neighbor if surrogate found
 - Surrogate matches with free neighbor if exists

u' matches with a



 Match with neighbor if surrogate found

- Surrogate matches with free neighbor if exists
- Similar procedure for deletions

u' matches with a



 Round complexity: O(log Δ) worst-case

u' matches with a

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 - Search at most ∆ neighbors, doubling

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 - Need to search at most $2\sqrt{m}$ neighbors

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No two vertices in the independent set are neighbors

All vertices that can be added to the independent set are added



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Edge Insertions May Violate Independence



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Our Result: $O(m^{2/3} \log^2 n)$ amortized messages, $O(\log^2 n)$ amortized rounds

Does not need connectivity assumption

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 - High-degree nodes with no neighbors in MIS are added to MIS after processing all low-degree nodes
 - Low-degree node entering/exiting MIS causes all high-degree nodes to find new MIS in induced subgraph (this is a global restart)

Distributing Challenges

Challenge 1: How do nodes determine if they're high-degree/lowdegree as *m* changes with updates (for unknown *m*)?

Easy to achieve if the graph remains **connected throughout updates**

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Challenge 2: How do high-degree nodes compute maximal independent set in **small number of rounds** and **few messages**?

Global restarts are expensive

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• Algorithm:

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- Algorithm:
 - Low-degree vertices prioritize in MIS



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 - Add neighbors into MIS if possible, prioritizing lowdegree, then highdegree, potentially many



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 - Low-degree vertices prioritize in MIS
 - On edge deletion:
 - Prioritize low-degree nodes, then high-degree
 - Add additional nodes to MIS if possible
 - Potentially many highdegree nodes added/removed

Important Notes:

• Edge insertion/deletion could cause nodes to switch low/high-degree

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- Edge insertion/deletion could cause nodes to switch low/high-degree
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- But need to know which vertices are low-degree and highdegree (unknown m and potentially disconnected graph)!
- Low-degree nodes entering MIS car hause many high-degree nodes to le
- Low-degree nodes leaving MIS can cause many high-degree nodes to enter
 - Challenge 1: How do nodes determine if they're high-degree/lowdegree as *m* changes with updates (for unknown *m*)?
- Instead, we use high-degree nodes in local neighborhood (details later)

Important Notes:

- Edge insertion/deletion could cause low degree nodes to enter or leave MIS
- Run [AOSS18] on the low-degree node to determine set of low-degree

Challenge 2: How do high-degree nodes find maximal independent set in small number of rounds and few messages?

- Low-degree nodes leaving MIS carbon use many high-degree nodes to enter
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• p_v updates to the **current degree** when low-degree



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 Solving Challenge 2: how to determine MIS among highdegree neighbors



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- Vertices which became lowdegree, priority in joining MIS



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Suppose instead *x*, *y* high-degree



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 Run static, distributed MIS algorithm on induced subgraph of high-degree nodes in local neighborhood



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- Overall complexity:
 - Message complexity:
 - $O(m^{2/3} \log^2 n)$ amortized

Distributed Dynamic MIS v picked into MIS by Members of MIS static algorithm ν v а High-degree Low-degree

m is average number of edges over all updates

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Distributed Dynamic MIS

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Distributed Dynamic MIS

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 - Amortization due to local restarts

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 - Amortization from running [AOSS18] to add lowneighbors to MIS

Conclusion and Open Questions

 Initialize formal study of message-efficient dynamic algorithms in distributed networks

Grand Prize:

- message complexity matches update time of best-known sequential, centralized algorithm
- round complexity is O(1)
- Achieved for several fundamental symmetry breaking problems (up to O(log² n) factors for MIS, and smaller for other problems)
- Solve several general challenges unknown *m* and global restarts

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 Initialize formal study of message-efficient dynamic algorithms in distributed networks

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Question 1: Can our techniques be generalized for a wide class of dynamic distributed algorithms?

Question 2: Can we achieve worst-case bounds (esp. rounds) for MIS?

Question 3: Can we get rid of the $O(\log^2 n)$ factors especially in round complexity of MIS?

Question 4: Can our algorithms be modified to handle multiple concurrent updates, while maintaining low message complexity?

Question 5: Is there a general purpose compiler which takes a centralized dynamic algorithm and outputs a message-efficient distributed dynamic algorithm?