# Improved Distributed Algorithms for Coloring Interval Graphs with Application to Multicoloring Trees

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### Distributed Vertex Coloring

**Input:** G = (V, E), n = |V|, max. degree  $\Delta$ 

The  $\mathcal{LOCAL}$  and  $\mathcal{CONGEST}$  Models:

- Nodes host processors and have unique IDs
- Synchronous communication along edges, individual messages *LOCAL*: messages of unbounded size *CONGEST*: messages of size O(log n)
- Local computation is free
- Running time = number of communication rounds

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### Minimum Vertex Coloring Problem:



Output: Upon termination of algorithm, every node knows its color

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- Exponential time algorithms  $n^{\epsilon}$  approximation in exp $O(\frac{1}{2})$  re

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- O(1)-approximation in O(log\* n) rounds on interval graphs [Halldórsson, Konrad, 2014]
- This work: Improvements on [Halldórsson, Konrad, 2014]

Interval Graphs: Intersection graph of intervals on the line



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#### [Halldórsson, Konrad, 2014] :

- Constant factor approximation in O(log\* n) rounds (*LOCAL*)
- $\bullet$  Interval boundaries known: adaptation to  $\mathcal{CONGEST}$
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#### **Our Results:**

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**Approximation Factor?** # colors used in coloring completion step

### MIS algorithm $\rightarrow$ distance-k MIS algorithm:

- Simulate MIS on  $G^k$  (nodes adjacent if distance at most k)
- MIS in r rounds gives distance-k MIS in O(kr) rounds

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**Definition:** G is of *bounded-independence* if there exists bounding function f(r) so that for each  $v \in V$ , the size of a maximum independent set in the *r*-neighborhood of v is at most f(r).

Path/Ring:



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Interval Graphs:



- Extract subgraph of *proper intervals* (= unit interval graph)
- Distance-k MIS in O(k log\* n) rounds

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#### **Circular Arc Graphs:**

- Load *L*(*G*): Largest subset containing the same point
- Circular cover length *l*(*G*): cardinality of smallest subset of arcs covering the circle

(F) = 3

Goal: Prove that color completion with few colors exists



#### **Circular Arc Graphs:**

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- Circular cover length *I*(*G*): cardinality of smallest subset of arcs covering the circle

[Valencia-Pabon, 2003] :

 $\lfloor \left(1 + \frac{1}{l(G)-2}\right) L(G) \rfloor + 1$  colors suffice to color circular arc graph G

(F) = 3











- $\mathcal{LOCAL}$  model algorithm
- **2** Adaptation to CONGEST

# Algorithm in the CONGEST model

### Adapting the $\mathcal{LOCAL}$ algorithm:

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#### Assumption:

Interval representation is known

#### **Remaining Difficulty:**

Color completion requires knowledge of distance- $\Theta(k)$  neighborhood

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### Implementation in CONGEST via Color Rotations

# Greedy Colorings



#### Greedy Coloring Sweep:

Traverse intervals with increasing left boundaries, assign smallest possible color  $\rightarrow$  Optimal coloring

 $\mathcal{CONGEST}$  model version:



# Greedy Colorings



#### Greedy Coloring Sweep:

Traverse intervals with increasing left boundaries, assign smallest possible color  $\rightarrow$  Optimal coloring

CONGEST model version:



 $n_i$  reaches out furthest to the right,  $u, n_1, n_2, \ldots, n_{i+1}, v$  forms path P

# Greedy Colorings



#### Greedy Coloring Sweep:

Traverse intervals with increasing left boundaries, assign smallest possible color  $\rightarrow$  Optimal coloring

CONGEST model version:



Simulate Greedy coordinated by vertices in P in O(k) rounds

### Algorithm:

- *u* initiates left-to-right Greedy coloring γ<sub>1</sub>, respecting colors of Γ[*u*], not respecting colors of Γ[*v*] (initial colors)
- v initiates right-to-left Greedy coloring γ<sub>2</sub>, respecting colors of Γ[v], not respecting colors of Γ[u] (target colors)
- Transform  $\gamma_1$  into a coloring that respects colors of  $\Gamma[v]$



Gray: initial colors  $\gamma_1$ 

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Add  $\epsilon \chi(G)$  new colors Recolor vertices with initial colors  $1, \ldots, \epsilon \chi(G)$  to new colors

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Colors  $1, \ldots, \epsilon \chi(G)$  are unused

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Starting from  $\Gamma^2$ , recolor nodes with target color  $1, \ldots, \epsilon \chi(G)$  to their target color

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This leaves unused colors behind

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Run a Greedy left-to-right coloring, recoloring colors  $\{\epsilon\chi(G) + 1, \ldots, \chi(G)(1+\epsilon)\}$  to  $\{\epsilon\chi(G) + 1, \ldots, n\}$ 

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Repeat from  $\Gamma^4$  onwards

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- Coloring completion step can be implemented in O(k) rounds
- Overall runtime:  $O(\frac{1}{\epsilon} \log^* n)$

# Conclusion

### We presented:

- $(1 + \epsilon)$ -approximation in  $O(\frac{1}{\epsilon} \log^* n)$  rounds
- $\bullet$  Interval boundaries known: adaptation to  $\mathcal{CONGEST}$
- LB:  $\Omega(\frac{1}{\epsilon})$  rounds necessary
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### **Open Problems**

- Reduce round complexity to  $O(\frac{1}{\epsilon} + \log^* n)$  or prove LB of  $\Omega(\frac{1}{\epsilon} \log^* n)$
- $(1 + \epsilon)$ -approximation on chordal graphs in  $O(\frac{1}{\epsilon} \log n)$  rounds?

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