# Distributed coloring of graphs WITH AN OPTIMAL NUMBER OF COLORS 

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STACS 2019
Berlin, March 15 th, 2019

## Distributed algorithms

The LOCAL model:

- Graph of size $n$, every vertex is given a unique ID between 1 and $n$
- Every vertex can send messages of unlimited size to its neighbors in the graph
- Synchronous rounds
- No failure
- Infinite local computational power

Any problem is solvable in $O(n)$ rounds !

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Distributed coloring, why do we care ?

- Coloring is a very powerful tool to adapt sequential algorithms to distributed model
- Nice question as many sequential coloring algorithms are challenging to adapt



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Question: can we go further?
No for $\Delta=4$

## Coloring graphs of maximum degree $\Delta$

For any $\Delta$, let $k_{\Delta}$ be the maximum integer $k$ such that $(k+1)(k+2) \leq \Delta$. It can be checked that $\sqrt{\Delta}-3<k_{\Delta}<\sqrt{\Delta}-1$.

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Theorem (Embden-Weinert, Hougardy, Kreuter 1998)
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Theorem (Molloy Reed 2001-2014)
For sufficiently large (but constant) $\Delta$, and every $c \geq \Delta-k_{\Delta}$, there is a linear time deterministic algorithm to test whether graphs of maximum degree $\Delta$ are c-colorable. Furthermore, there is a polynomial time deterministic algorithm that will produce a c-coloring whenever one exists.

## Distributed coloring

When $\Delta=O(1)$, graphs of maximum degree $\Delta$ can be colored with $\Delta+1$ colors in $O\left(\log ^{*} n\right)$ rounds (SIAM J. Discrete Math. 1988, SIAM Journal on Computing 1992), and the round complexity is best possible already for paths.

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In general, $(\Delta+1)$-coloring is a very active field of research with the current state-of-the art running times: $O\left(\sqrt{\Delta \log \Delta} \log ^{*} \Delta+\log ^{*} n\right)$ deterministic complexity (FOCS $2016+$ PODC 2018) and $O(\sqrt{\log \Delta})+2^{O(\sqrt{\log \log n})}$ randomized complexity (STOC $2016+$ STOC 2018).

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The $\Delta$-coloring problem (Brooks Theorem) can be solved in $O(\log \Delta)+2^{O(\sqrt{\log \log n)}}$ rounds w.h.p. when $\Delta \geq 4$, or $O\left((\log \log n)^{2}\right)$ rounds w.h.p. when $\Delta \geq 3$ is a constant (PODC 2018).

## Our Results

Recall that $k_{\Delta} \approx \sqrt{\Delta}-2$.
Theorem (B. and Esperet 2018)
When $c \leq \Delta-k_{\Delta}$, there exist arbitrarily large graphs $G$ of maximum degree $\Delta$ for which $\chi(G)=c$, and such that any distributed algorithm coloring $G$ with $c$ colors takes $\Omega(n / \Delta)$ rounds.

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## Theorem (B. and Esperet 2018)

For sufficiently large $\Delta$, there is a distributed randomized algorithm running w.h.p. in $\min \left\{O\left(\log ^{1 / 12}(\Delta) \log n\right), 2^{O(\log \Delta+\sqrt{\log \log n)}}\right\}$ rounds, that takes a graph $G$ with maximum degree $\Delta$ in input, and outputs, for any $c \geq \Delta-k_{\Delta}+1$, either a certificate that $G$ is not $c$-colorable, or a $c$-coloring of $G$.

## Graphs that are hard to color optimally

Recall that $k_{\Delta}$ is the greatest integer such that $\left(k_{\Delta}+1\right)\left(k_{\Delta}+2\right) \leq \Delta$ (hence $k_{\Delta} \approx \sqrt{\Delta}-2$ ) and $c \leq \Delta-k_{\Delta}$

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Set $G$ to be a clique of size $c+1$ and take out a vertex $v$.
Set $C$ to be a clique of size $c-1$ and $S$ a stable set of size $\Delta-c+2$. We can ensure the maximum degree is still $\Delta$ because $(\Delta-c+1)(\Delta-c+2) \geq \Delta$.

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When $c \leq \Delta-k_{\Delta}$, there exist arbitrarily large graphs $G$ of maximum degree $\Delta$ for which $\chi(G)=c$, and such that any distributed algorithm coloring $G$ with $c$ colors takes $\Omega(n / \Delta)$ rounds.

## Overview of the proof

We call a vertex dense if its neighborhood has more than $\binom{\Delta}{2}-\Delta^{3 / 2}$ edges. A vertex $v$ that is not dense is said to be sparse.

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We say that $S, X_{1}, X_{2}, \ldots, X_{t}$ is a dense decomposition of $G$ if:
(1) $S, X_{1}, X_{2}, \ldots, X_{t}$ partition $V$.
(2) every $X_{i}$ has between $\Delta-8 \Delta^{1 / 2}$ and $\Delta+4 \Delta^{1 / 2}$ vertices.
(3) There are at most $8 \Delta^{3 / 2}$ edges between $X_{i}$ and $V-X_{i}$.
(1) a vertex is adjacent to at least $\frac{3 \Delta}{4}$ vertices of $X_{i}$ if and only if it is in $X_{i}$.
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Such a decomposition can be computed in a constant number of rounds.

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Theorem (Chung, Pettie, Su 2014)
If $e p d^{2}<1$, then there is a distributed randomized algorithm, running in $H$ w.h.p. in $O(\log n)$ rounds, that finds a value assignment to the variables of $X$ such that no event from $B$ holds.

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Theorem (Ghaffari, Harris, Kuhn 2017)
If $2^{15} p d^{8}<1$, then there is a distributed randomized algorithm, running in $H$ w.h.p. in $2^{O(\log d+\sqrt{\log \log n)} \text { rounds, that finds a value assignment to the variables }}$ of $X$ such that no event from $B$ holds.

## A CERTIFICATE OF NON-COLORABILITY

## Theorem (B. and Esperet 2018)

For sufficiently large $\Delta$, there is a distributed randomized algorithm running w.h.p. in $\min \left\{O\left(\log ^{1 / 12}(\Delta) \log n\right), 2^{O(\log \Delta+\sqrt{\log \log n})}\right\}$ rounds, that takes a graph $G$ with maximum degree $\Delta$ in input, and outputs, for any $c \geq \Delta-k_{\Delta}+1$, either a certificate that $G$ is not $c$-colorable, or a $c$-coloring of $G$.

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## Theorem (Molloy and Reed 2001-2014)

For sufficiently large $\Delta$, and for $c \geq \Delta-k_{\Delta}+1$, if $G$ has maximum degree at most $\Delta$, and $\chi(G)>c$, then there is some vertex $v$ in $G$ such that the subgraph induced by $\{v\} \cup N(v)$ is not $c$-colorable.

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## Overview of the algorithm

Build a nice c-coloring of each dense part.


## Overview of the algorithm

Contract each color class of size greater than 1 and add edges to make it a clique.


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## Questions

Thank you for your attention.

