# Online Max-Edge-Coloring of Paths and Trees 

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TOLA, July 7, 2014

## Edge Coloring



An edge coloring of the Petersen graph using 4 colors.

## Minimum Edge Coloring

Classical edge coloring:

- Color the edges of a graph using as few colors as possible.


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Vizing's Theorem
Let $G$ be a simple graph of maximum degree $\Delta(G)$. The minimum number of colors needed to color all edges of $G$ is either $\Delta(G)$ or $\Delta(G)+1$.

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For $k=1$, this is the maximum matching problem.

## Online Edge Coloring

Online Edge- $k$-Coloring

- Edges arrive one by one.
- Must immediately color a newly arrived edge with one of the $k$ colors or reject the edge.
- The decision is irrevocable.


## Example for $k=2$



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## Online Edge Coloring

Competitive analysis [Sleator, Tarjan '85], [Karlin et al. '88]
An algorithm A is $c$-competitive if

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\mathrm{A}(\sigma) \geq c \cdot \mathrm{OPT}(\sigma)-b
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for all sequence of edges $\sigma$.
For a randomized algorithm, replace $\mathrm{A}(\sigma)$ with $E[\mathrm{~A}(\sigma)]$.
The competitive ratio $C=\sup \{c: \mathrm{A}$ is $c$-competitive $\}$.

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No deterministic algorithm has a competitive ratio better than $\frac{1}{2}$. No randomized algorithm has a competitive ratio better than $\frac{4}{7}$.

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- Positive results:

The competitive ratio of a fair algorithm is at least $2 \sqrt{3}-3 \approx 0.46$ An algorithm is fair if it never rejects an edge unless forced to do so.

## What?

- In order to obtain a more fine-grained analysis, we study Edge- $k$-Coloring on some basic graph classes:
- For paths, we give an optimal (randomized) algorithm.
- For trees, we show that a natural algorithm called First-Fit is optimal among deterministic algorithms.
- For trees and "tree-like" graphs, we show that any fair algorithm for online Edge- $k$-Coloring performs well if $k$ (the number of colors) is sufficiently large.

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- Natural building blocks for studying more complicated graph classes.
- All previous (negative) results for Edge- $k$-Coloring holds when the input graph is a bipartite graph.


## Algorithms

Recall that the competitive ratio of a fair algorithm is at least $2 \sqrt{3}-3 \approx 0.46$ and at most $\frac{1}{2}$ (Favrholdt, Nielsen '03).
The following fair and deterministic algorithms have been studied:

- First-Fit uses the lowest available color when coloring an edge. It can be viewed as the natural greedy strategy.


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- First-Fit uses the lowest available color when coloring an edge. It can be viewed as the natural greedy strategy.
- Next-Fit remembers the last used color $c_{\text {last }}$. When coloring an edge, it uses the first available color in the ordered sequence $\left\langle c_{\text {last }}+1, \ldots, k, 1, \ldots, c_{\text {last }}\right\rangle$.


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Next-Fit is shown to have a competitive ratio of exactly $2 \sqrt{3}-3$. The competitive ratio of First-Fit is shown to be at most 0.48.


## Relationship to vertex coloring

- Edge coloring a graph $G$ is equivalent to vertex coloring the line graph of $G$.
- This also holds in an online setting.
- In particular, online Edge- $k$-Coloring on paths is exactly the same as online dual vertex coloring on paths.



## Edge-2-Coloring on Paths

- Next-Fit has a competitive ratio of $\frac{1}{2}$ on paths.

$$
\because \quad \circ \quad \stackrel{1}{\square}
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No deterministic algorithm can do better than $\frac{2}{3}$.

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- Can a randomized algorithm do better than $\frac{2}{3}$ ?
- Yes! There is a randomized algorithm with a competitive ratio of $\frac{4}{5}$.


## $\operatorname{Rand}_{p}$

Let $\frac{1}{2} \leq p \leq 1$. Define $\operatorname{Rand}_{p}$ as follows:

- For isolated edges, use the color 1 with probability $p$ and the color 2 with probability $1-p$. Non-isolated edges are colored if possible.


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- Two types of rejections:

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Dashed edge is colored with probability $p^{2}+(1-p)^{2}$.

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Dashed edge is colored with probability $p(1-p)+(1-p) p$.

## $\operatorname{Rand}_{p}$

Choose the parameter $p$ so that we balance the two situations: $p=\frac{\varphi}{\sqrt{5}} \approx 0.72$ gives a competitive ratio of $\frac{4}{5}$.


## Randomization

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- No. We prove this using Yao's minimax principle.


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- The competitive ratio of First-Fit is exactly $\frac{k-1}{k}$.
- First-Fit is optimal among deterministic or fair algorithms.


## First-Fit vs Next-Fit on Trees



## Charging technique for proving positive results

Three types of edges for a deterministic algorithm A:

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- Single colored: Colored only by A.
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Single colored edges will have a surplus of 1 .

## Fair Algorithm on Trees

Any fair algorithm $F$ has a competitive ratio of at least $C=\frac{2 \sqrt{k}-2}{2 \sqrt{k}-1}$.

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## Fair Algorithm on Trees

Strategy for redistributing the surplus:


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Worst-case: Roughly $\sqrt{k}$ colored child edges.

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$m(v)=\frac{8}{5}$.
$v$ transfers $\frac{4}{5}$ to $(w, v)$ and $\frac{2}{5}$ to each of $(v, x)$ and $(v, y)$.


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Step 1 Consider in turn all edges $e=(v, u) \in E_{c}$. Let $c$ be the color assigned to $e$ by First-Fit and let $e^{\prime}=(w, v)$ be the parent edge of $e$.
Step 1.1 If $e^{\prime} \in E_{\mathrm{d}}$ and $e^{\prime}$ has been colored with a color $c^{\prime}>c$, then $e$ transfers a value of $\frac{1}{k}$ to $w$.
Step 1.2 Any surplus remaining at $e$ is transferred to $v$.
For each vertex $v$, let $m(v)$ denote the value transferred to $v$ in step 1 .
Step 2 Consider in turn all vertices $v \in V$.
Step 2.1 If $v$ has a parent edge $e^{\prime}$ and $e^{\prime} \in E_{\mathrm{r}}$, then $v$ transfers a value of $\min \left\{m(v), \frac{k-1}{k}\right\}$ to $e^{\prime}$.
Step 2.2 Any value remaining at $v$ is distributed equally among the child edges of $v$ belonging to $E_{r}$.

## Negative result for Edge- $k$-Coloring of Trees

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A similar construction shows that no fair or deterministic algorithm can do better than $\frac{k-1}{k}$.
Furthermore, one can show that the competitive ratio of Next-Fit is no better than $\frac{2 \sqrt{k}-2}{2 \sqrt{k}-1}$ when $k$ is a square number.

## Randomization on Trees

- First-Fit is optimal on trees among fair or deterministic algorithms with a competitive ratio of $\frac{k-1}{k}$.
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- First-Fit is optimal on trees among fair or deterministic algorithms with a competitive ratio of $\frac{k-1}{k}$.
- Can a randomized algorithm do better than $\frac{k-1}{k}$ ?
- Maybe, but not better than $\frac{k}{k+1}$.


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- The pseudoarboricity (PA) of $G$ is the minimum $t$ such that the edges of $G$ can be oriented to form a digraph where each vertex has outdegree at most $t$.
- Trees have $\mathrm{PA}=1$. Planar graphs have PA at most 3 .
- Graphs of bounded degree, treewidth, degeneracy or genus has bounded PA.


## Parameterized Competitive Ratio

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Theorem
Suppose that the input graph is $k$-colorable and has PA at most $t$. If $t \leq \frac{1}{4} k$, then the competitive ratio of any fair algorithm is at least

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The competitive ratio on $k$-colorable graph is also known as the competitive ratio on accommodating sequences [Boyar, Larsen, Nielsen '98].

## Parameterized Competitive Ratio

A lower bound for any fair algorithm on planar graphs ( $\mathrm{PA} \leq 3$ ).


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- First-Fit is optimal among deterministic algorithms on paths and trees.
- On tree-like graphs, any fair algorithm for online Edge- $k$-Coloring performs well if it has a sufficiently large number of colors.


## Open Problems

- Find the optimal online algorithm for Edge- $k$-Coloring in general and on other graph classes.


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Is it possible to achieve a competitive ratio better than $2 \sqrt{3}-3$ for Edge- $k$-Coloring?
Does First-Fit have a competitive ratio better than $2 \sqrt{3}-3$ for Edge- $k$-Coloring?On bipartite graphs?

## THANK YOU

