Online Edge Coloring: Sharp Thresholds

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David Wajc

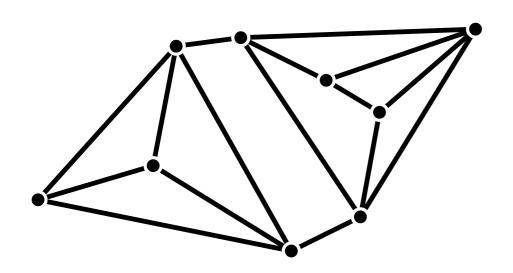




Given: Graph G = (V, E)

Goal: Color edges with few colors

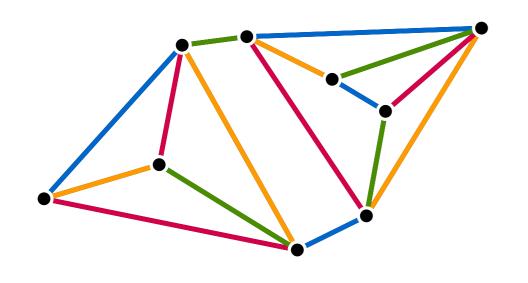
Constraint: No two incident edges get the same color



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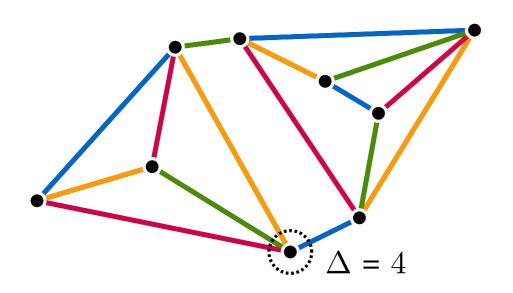


4 colors? Optimal?

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Optimal?

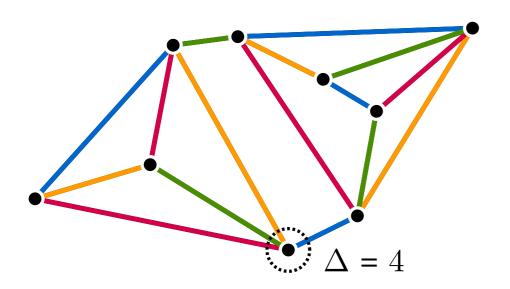
 $\Delta := \max_{v \in V} \deg(v)$

Claim: $\#Colors \ge \Delta$

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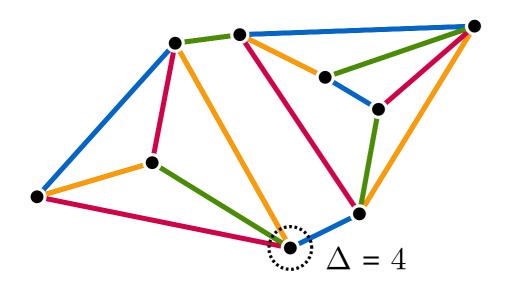
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Theorem: $\#\text{Colors} \leq \Delta + 1$ [Vizing 1964]

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Optimal?

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Theorem: $\#\text{Colors} \leq \Delta + 1$ [Vizing 1964]

Answer = Δ or $(\Delta + 1)$

NP-complete deciding which

 $O(|E| \log |E|)$ time compute $\Delta + 1$ [ABBCSZ'25]

Online: Graph revealed over time: edge-by-edge. Max-degree Δ known.

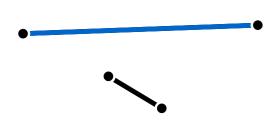
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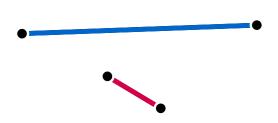
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Task: Color edge *irrevocably* when it is revealed.

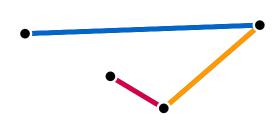


Two-Player Game:

- Adversary (reveals edges)
- Online Algorithm (colors edges)

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Two-Player Game:

- Adversary (reveals edges)
- Online Algorithm (colors edges)

How many colors do we need? Still $\approx \Delta$?

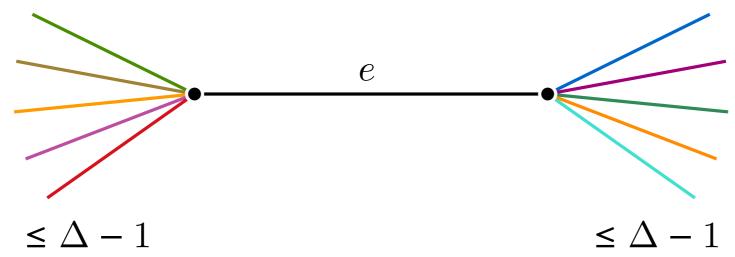
Warm-up: Greedy Algorithm

Greedy: Color edge with "lowest" avaliable color. Colors = $\{1, 2, 3, \ldots\}$

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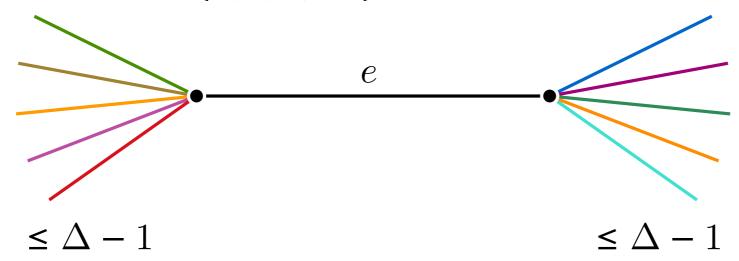
Colors =
$$\{1, 2, 3, ...\}$$



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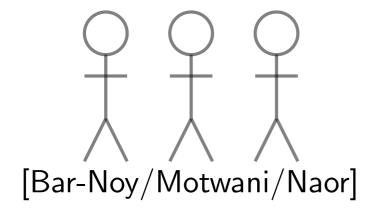


Claim: $\leq 2(\Delta - 1)$ blocked colors

Claim: Greedy uses $\leq 2\Delta - 1$ colors

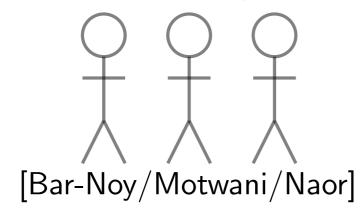
1992:

Can we beat greedy?



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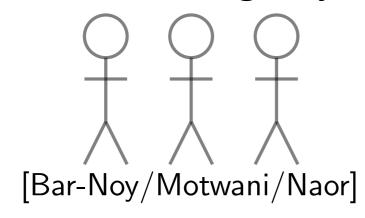




"The Greedy Algorithm is Optimal for Online Edge Coloring"

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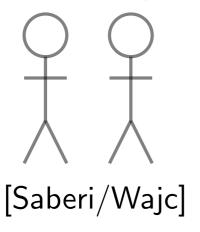




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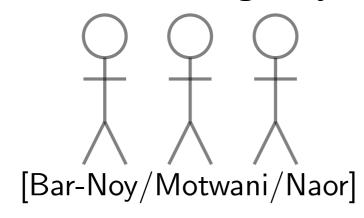
Is it though...?

2021:



1992:

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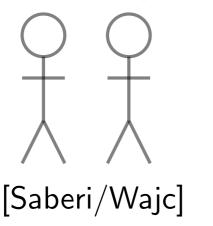




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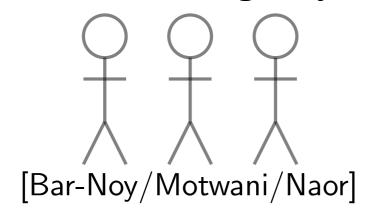




"The Greedy Algorithm is **Not** Optimal for Online Edge Coloring"

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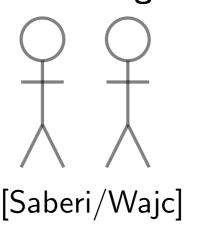


"The Greedy Algorithm is Optimal for Online Edge Coloring" when $\Delta \leq \log n$ (deterministic)

when $\Delta \leq \sqrt{\log n}$ (randomized)

Is it though...?

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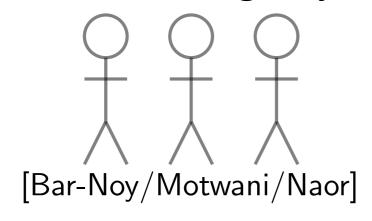




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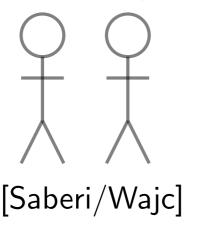


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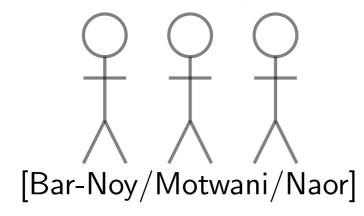


"The Greedy Algorithm is **Not** Optimal for Online Edge Coloring"

when $\Delta \gg \log n$ (randomized) under vertex-arrivals

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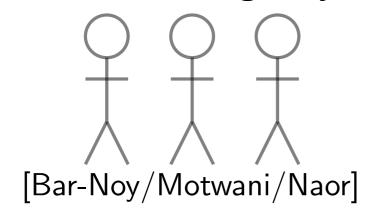
"The Greedy Algorithm is Optimal for Online Edge Coloring" * when $\Delta \leq \log n$ (deterministic) when $\Delta \leq \sqrt{\log n}$ (randomized)

Conjecture:

There is an online randomized $(1+o(1))\Delta$ -edge-coloring algorithm when $\Delta = \omega(\log n)$.

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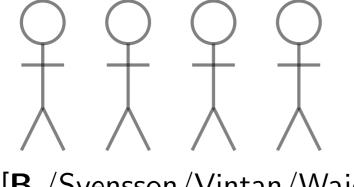
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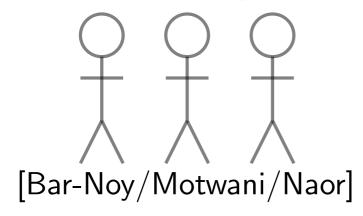
2024:



[B./Svensson/Vintan/Wajc]

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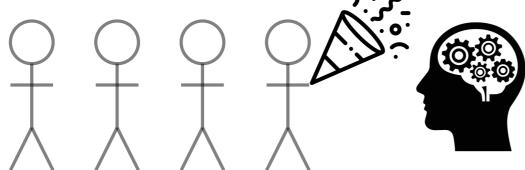


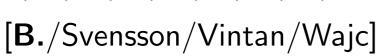
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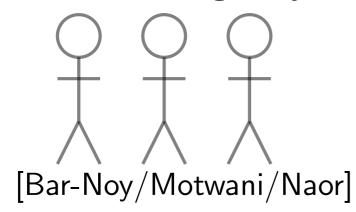


"Online Edge Coloring is (Nearly) as Easy as Offline"

The End?

1992:

Can we beat greedy?





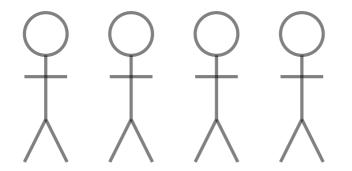


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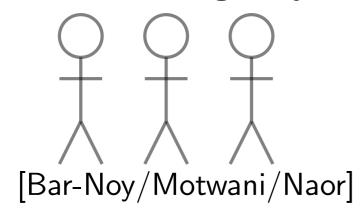
What about Deterministic Algos?



[B./Svensson/Vintan/Wajc]

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"...less plausible for the deterministic case"



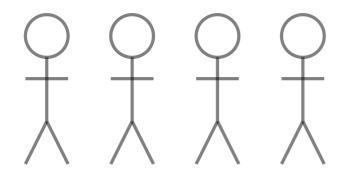


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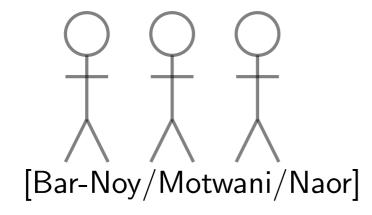
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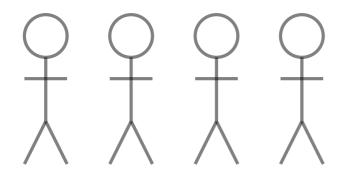


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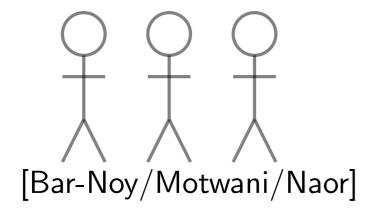


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Can we improve the Lower Bounds?

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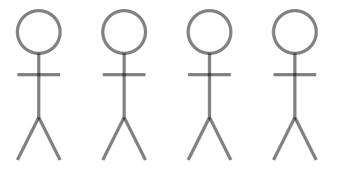


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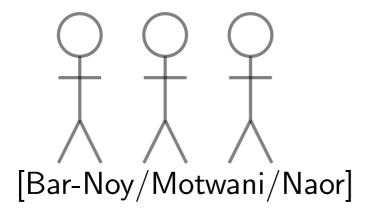
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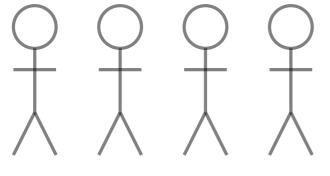


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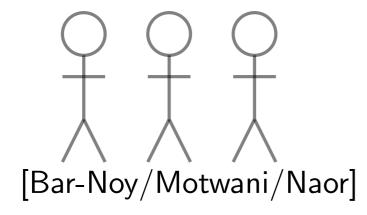






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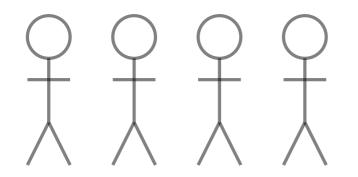


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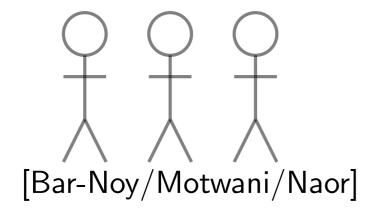
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Can we improve the Lower Bounds?

Design Determinstic Algo?

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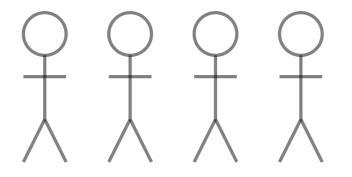


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SODA 2025: Two partial results





 $\approx \Delta$ colors, when $\Delta = \Theta(n)$ [DGS]

This Paper!

Conjecture:

[Bar-Noy/Motwani/Naor 1992]

There is an online randomized $(1+o(1))\Delta$ -edge-coloring algorithm when $\Delta = \omega(\log n)$.

Go beyond in two ways:

Theorem: [This Paper]

Online deterministic $(1 + o(1))\Delta$ -edge-coloring algorithm when $\Delta = \omega(\log n)$. Online randomized $(1 + o(1))\Delta$ -edge-coloring algorithm when $\Delta = \omega(\sqrt{\log n})$.

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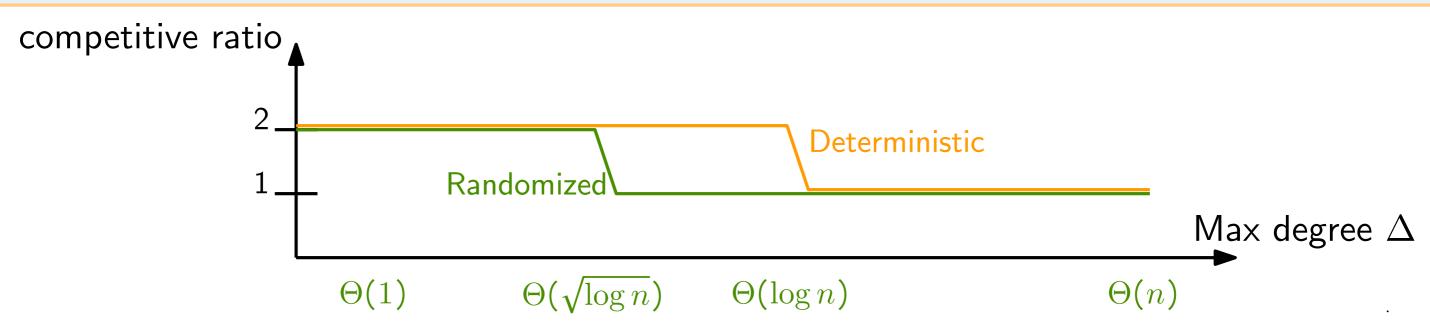
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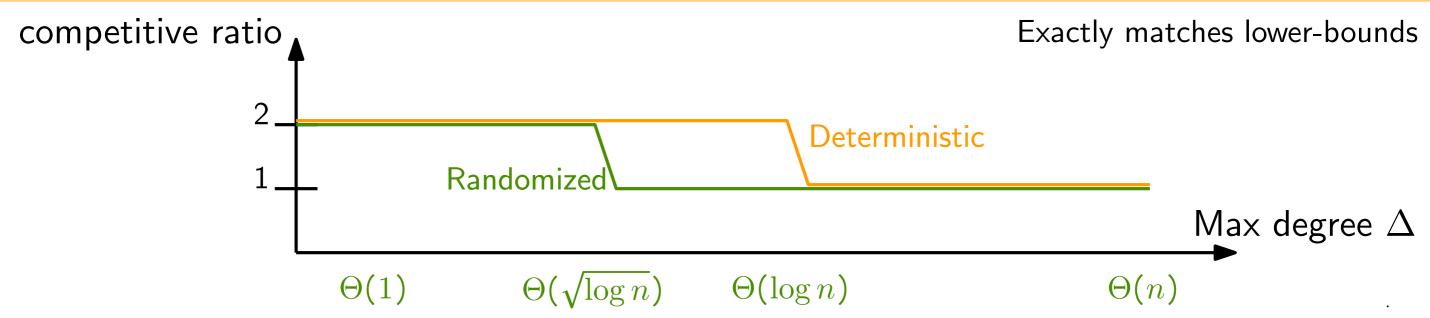
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Our algo: $\Delta + O(\Delta^{15/16} \log^{1/16}(n))$ colors

Open: close gap

Exactly matches lower-bounds

Lowerbound: $\Delta + \Omega(\log n + \sqrt{\Delta})$



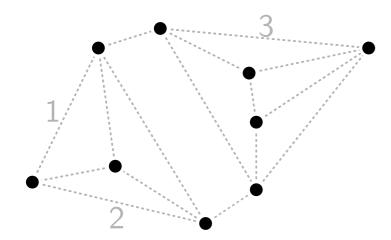
Oblivious





Oblivious

Fixes graph and arrival order in advance

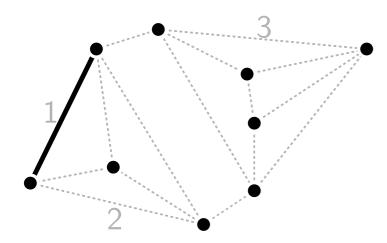






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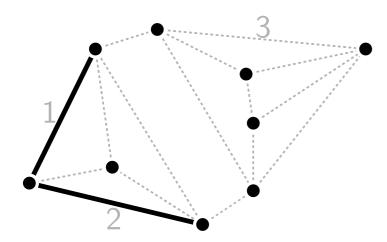






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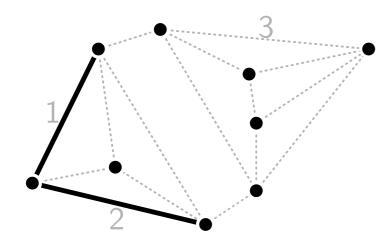






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Adaptive

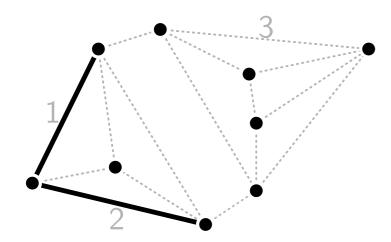


Generates graph adaptively based on algorithms decisions/randomness



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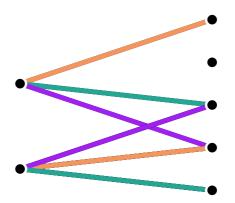
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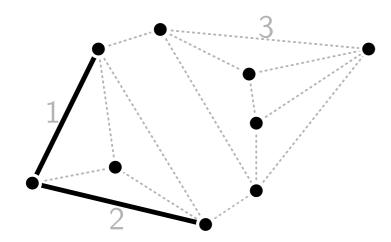
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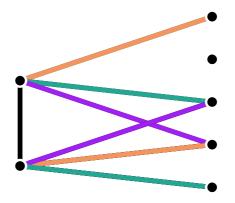
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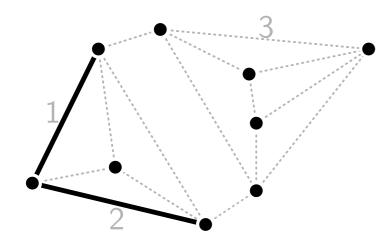


"I will connect to two vertices where purple is taken"



Oblivious

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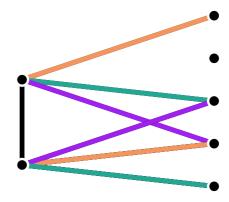


one (unknown) future

Adaptive



Generates graph adaptively based on algorithms decisions/randomness



"I will connect to two vertices where purple is taken"

many ($\gg n^{\Delta}$) possible futures



Oblivious

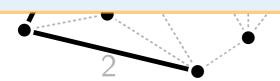
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Generates graph adaptively based on algorithms decisions/randomness

Randomness does not help against Adaptive adversary!



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many ($\gg n^{\Delta}$) possible futures



Oblivious

Fixes graph and arrival order in advance





Generates graph adaptively based on algorithms decisions/randomness

Randomness does not help against Adaptive adversary!

∃ randomized online algorithm against adaptive adversary ⇒ ∃ determinstic online algorithm





"I will connect to two vertices where purple is taken"

many ($\gg n^{\Delta}$) possible futures

one (unknown) future

Deterministic

Randomized Against Adaptive Adversary



ALGO: (simplified)

Initialize $P_{e,c} \leftarrow \frac{1-\varepsilon}{\Delta}$ for $e \in E$ and $c \in \{1, 2, \ldots, \Delta\}$

When e arrives:

Sample color c from $(P_{e,1}, P_{e,2}, \dots, P_{e,\Delta}, 1 - \sum_{c} P_{e,c})$

For potential future incident edges f:

Set
$$P_{f,c}^{\mathsf{new}} \leftarrow 0$$

ALGO: (simplified)

Initialize $P_{e,c} \leftarrow \frac{1-\varepsilon}{\Delta}$ for $e \in E$ and $c \in \{1, 2, \ldots, \Delta\}$

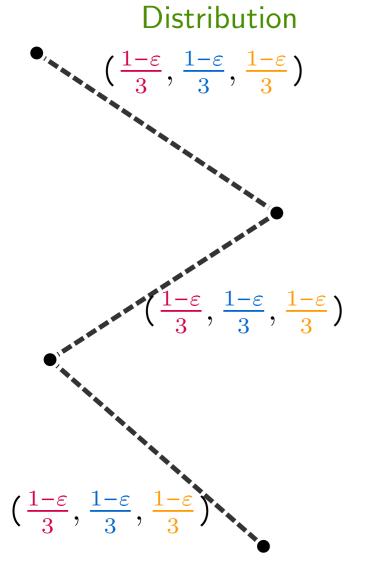
When e arrives:

Sample color c from $(P_{e,1}, P_{e,2}, \dots, P_{e,\Delta}, 1 - \sum_{c} P_{e,c})$

For potential future incident edges f:

Set
$$P_{f,c}^{\mathsf{new}} \leftarrow 0$$

Main palette $\{1,2,\ldots,\Delta\}$ Emergency palette $\{\Delta + 1, \dots, \Delta + 2\varepsilon\Delta\}$ (only use when necessary)



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Update $P_{f,k}^{\text{new}} \leftarrow P_{f,k}^{\text{old}} \cdot \frac{1}{1 - P_{e,k}}$ for all colors $k \neq c$

Main palette $\{1,2,\ldots,\Delta\}$ Emergency palette $\{\Delta+1,\ldots,\Delta+2\varepsilon\Delta\}$

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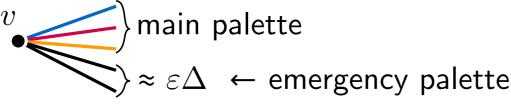
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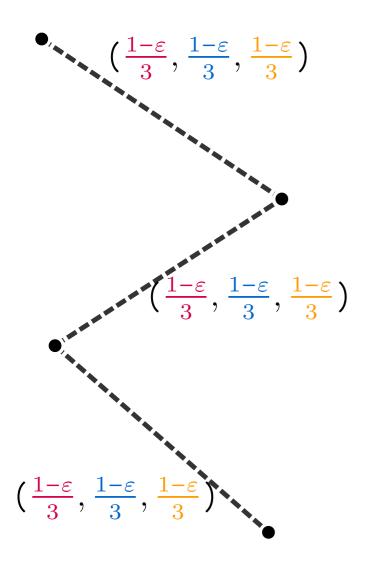
For potential future incident edges f:

Set
$$P_{f,c}^{\mathsf{new}} \leftarrow 0$$

Goal: $\Pr[\text{we assign } e \text{ color from main palette}] = 1 - \varepsilon$



"Forward to greedy"



ALGO: (simplified)

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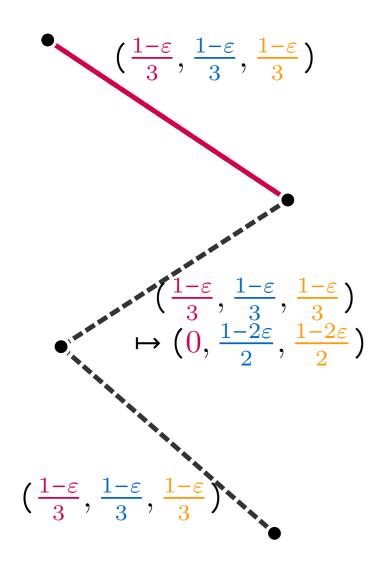
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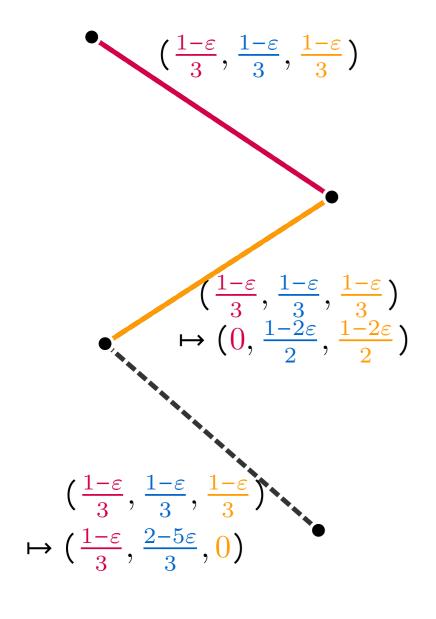
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"Bayesian Update"



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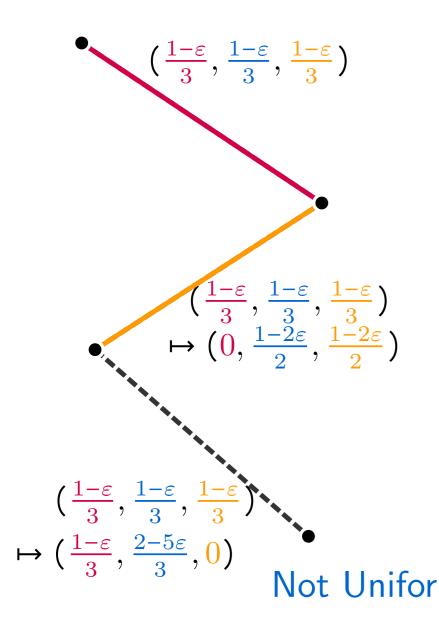
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"Bayesian Update"

Not Uniform! Depends on execution

- Fail if $\sum_{c} P_{e,c} > 1$
- Fail if $\sum_{c} P_{e,c} < 1 2\varepsilon$ ____ main palette emergency palette

ALGO: (simplified)

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- Fail if $\sum_{c} P_{e,c} > 1$

At time t = 0:

$$\forall e \in E, \quad \sum_{c} P_{e,c}^{(0)} = 1 - \varepsilon$$

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Goal: Show $\sum_{c} P_{e,c}^{(t)} \in [1 - 2\varepsilon, 1]$ for all times t, and edges e

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"Exercise": oblivious adversary and $\Delta \ge 10^4 \log n$

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"Exercise": oblivious adversary and $\Delta \ge 10^4 \log n$

 $\Pr[\text{edge } e \text{ bad}] \leq [\text{Azuma's}] \leq e^{-\Delta} \ll \frac{1}{n^{100}}$

simultaneously none of the $\leq n^2$ edges are bad, with high probability

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 $\Pr[\mathsf{bad}\;\mathsf{event}] = e^{-\Delta}$

$$\Delta \approx \sqrt{\log n}$$
 one (unknown) future

$$\Delta \approx \log n$$

$$n^{\Delta} \le e^{\Delta^2} \text{ futures}$$



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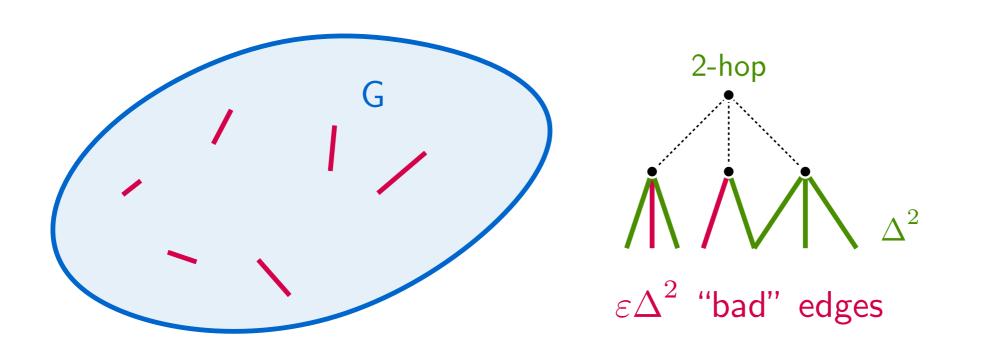
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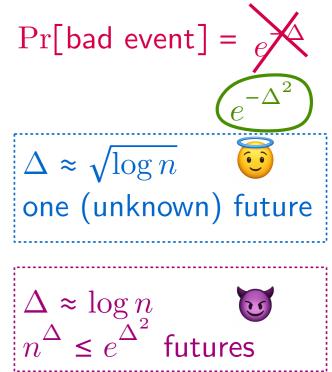


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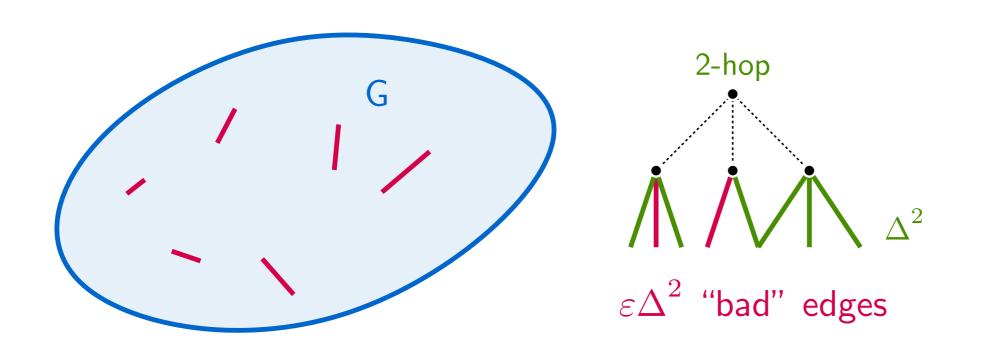


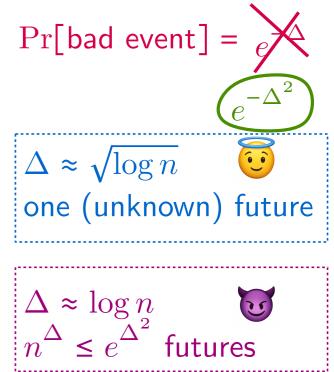


Main Idea to Fix: Bad events do happen, but they are spread out

Theorem:





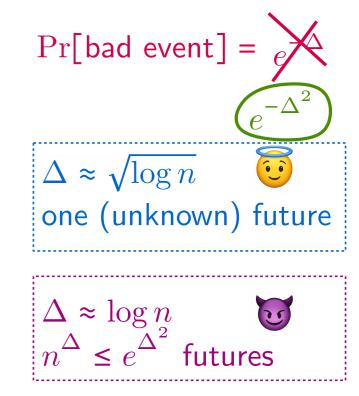


Main Idea to Fix: Bad events do happen, but they are spread out Add special-case handling for various bad events

Theorem:



Synonyms for "bad" events bad color



Main Idea to Fix: Bad events do happen, but they are spread out Add special-case handling for various bad events

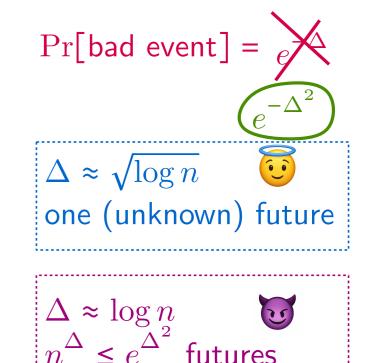
Theorem:



Synonyms for "bad" events

bad color

bad vertex



Main Idea to Fix: Bad events do happen, but they are spread out Add special-case handling for various bad events

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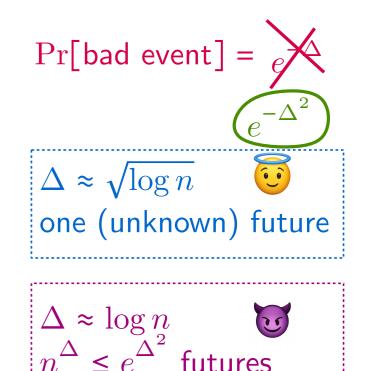


Synonyms for "bad" events

bad color

bad vertex

dangerous vertex



Main Idea to Fix: Bad events do happen, but they are spread out Add special-case handling for various bad events

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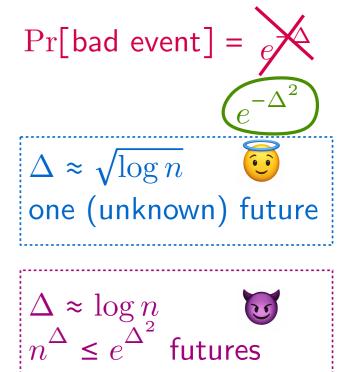


Synonyms for "bad" events

bad color hot vertex

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dangerous vertex



Main Idea to Fix: Bad events do happen, but they are spread out Add special-case handling for various bad events

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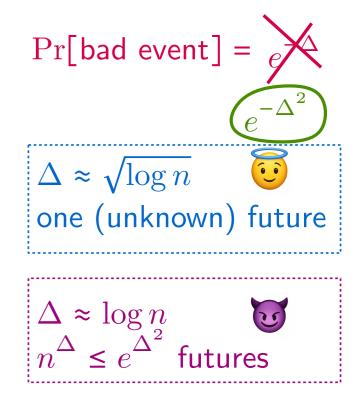
Analysis: Continuation + Adversaries

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Main Idea to Fix: Bad events do happen, but they are spread out Add special-case handling for various bad events

Theorem:

There is an $(1 + o(1))\Delta$ -edge-coloring algorithm when $\Delta = \omega(\sqrt{\log n})$ against oblivious There is an $(1 + o(1))\Delta$ -edge-coloring algorithm when $\Delta = \omega(\log n)$ against adaptive



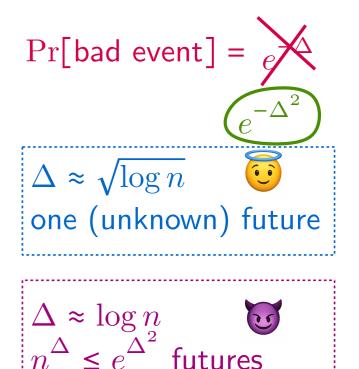
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dangerous vertex unlucky edge



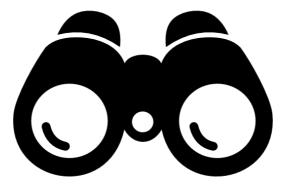
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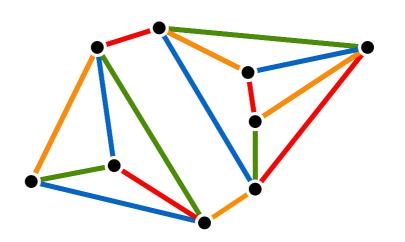
Summary and Future Thoughts



Greedy $2\Delta-1$ coloring optimal when Δ small

Conjecture: [Bar-Noy/Motwani/Naor 1992]

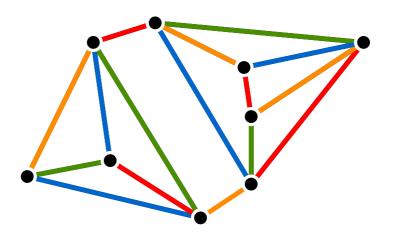
There is an online randomized $\approx \Delta$ -edge-coloring algorithm when $\Delta = \omega(\log n)$.



Greedy $2\Delta-1$ coloring optimal when Δ small

Conjecture: [Bar-Noy/Motwani/Naor 1992] Theorem: [BSVW 2024]

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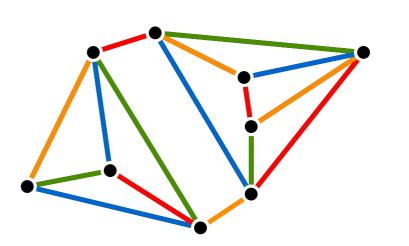


Greedy $2\Delta-1$ coloring optimal when Δ small

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Theorem: [This Paper]

Online deterministic $(1 + o(1))\Delta$ -edge-coloring algorithm when $\Delta = \omega(\log n)$. Online randomized $(1 + o(1))\Delta$ -edge-coloring algorithm when $\Delta = \omega(\sqrt{\log n})$.



Greedy $2\Delta-1$ coloring optimal when Δ small

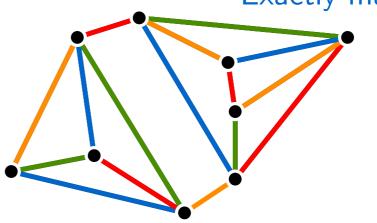
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Exactly matches lower bounds



Greedy $2\Delta-1$ coloring optimal when Δ small

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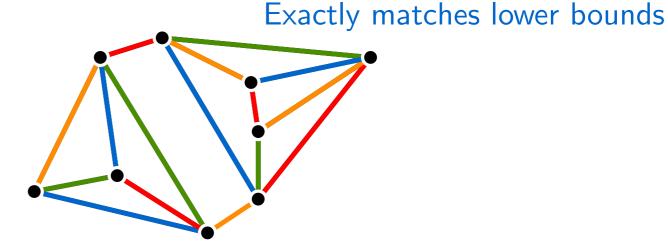
Bayesian algorithm

Deterministic = Randomized vs Adaptive

Martingale concentration $e^{-\Delta^2}$







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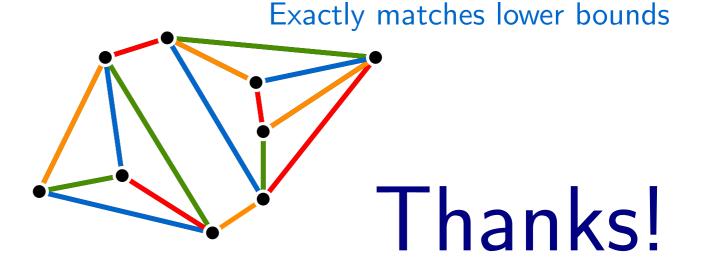
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Extra Slides

Edge Coloring Open Problems:

- Hypergraphs & Multigraphs
- Pinpoint the o(1) term:

Our algo: $\Delta^{15/16} \log^{1/16}(n)$ extra colors

Lowerbound: $\log n + \sqrt{\Delta}$

- Rounding fractional matchings
- Similar techniques for other problems: online weighted matching?
- List-Edge-Coloring Conjecture

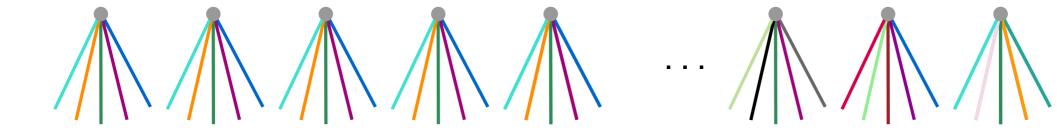
Theorem: No online algorithm can $(2\Delta - 2)$ -edge-color every graph.

[Bar-Noy/Motwani/Naor 1992]

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Idea (Adversary): Create lots of $(\Delta - 1)$ -stars

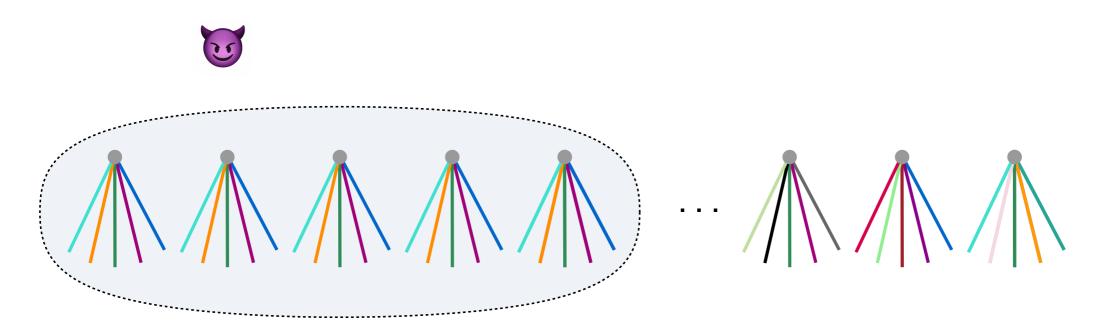


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Idea (Adversary): Create lots of $(\Delta - 1)$ -stars

Eventually have Δ stars colored the same (pigeonhole principle)

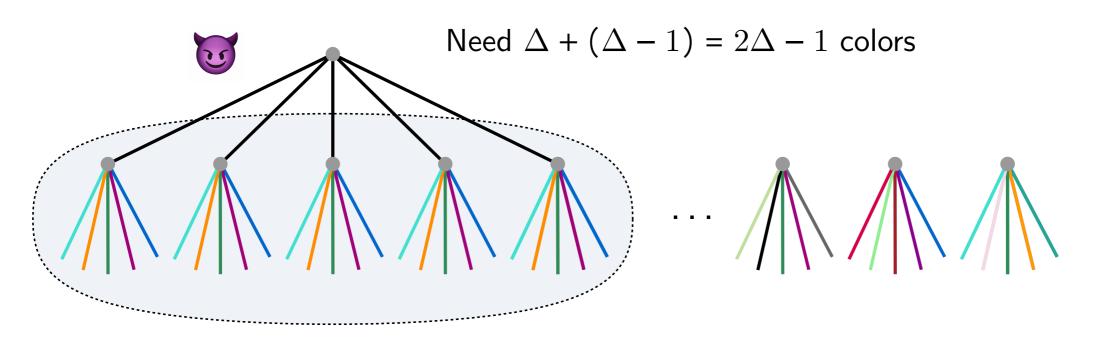


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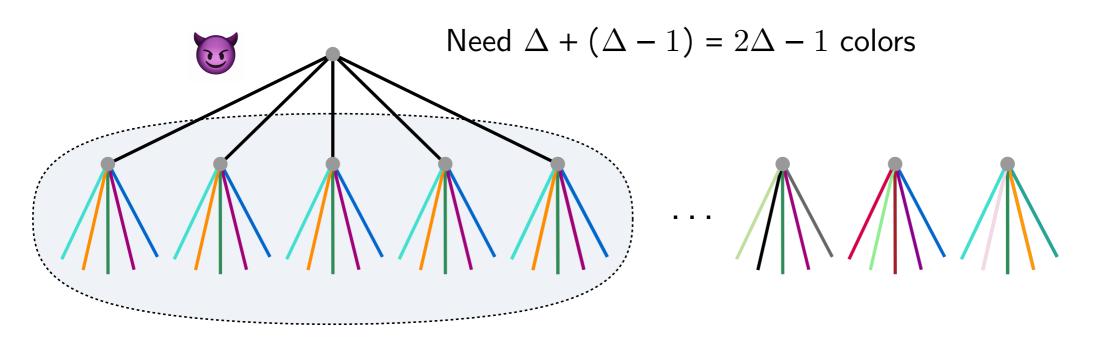


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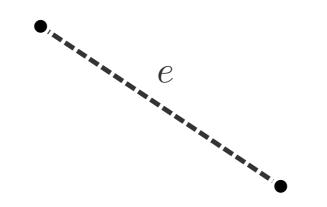
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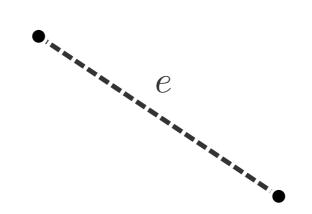


Focus on arriving edge e



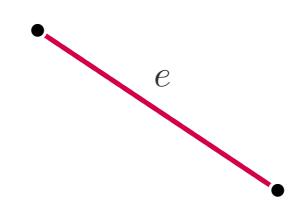
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Goal: $\Pr[\text{we assign } e \text{ color } c] = \frac{1-\varepsilon}{\Delta}$



Focus on arriving edge e

Goal: $\Pr[\text{we assign } e \text{ color } c] = \frac{1-\varepsilon}{\Delta}$



Initialize $P_{e,c} \leftarrow \frac{1-\varepsilon}{\Delta}$ for each color $c \in \{1, 2, \ldots, \Delta\}$

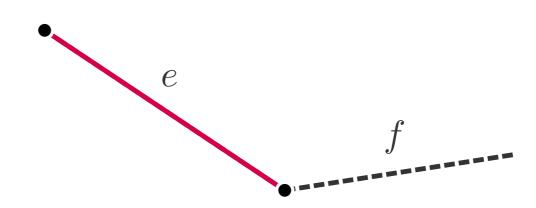
When e arrives:

Pr left uncolored → emergency palette

Sample color c from $(P_{e,1}, P_{e,2}, \dots, P_{e,\Delta}, 1 - \sum_{c} P_{e,c})$

Focus on arriving edge e

Goal: $\Pr[\text{we assign } e \text{ color } c] = \frac{1-\varepsilon}{\Delta}$



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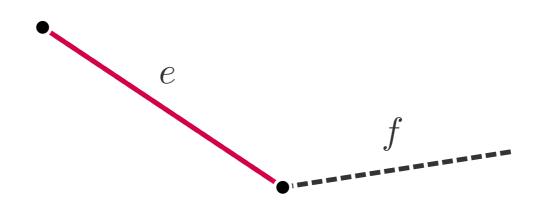
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For potential future incident edges f:

Need to set $P_{f,c}^{\text{new}} \leftarrow 0$

Focus on arriving edge e

Goal: $\Pr[\text{we assign } e \text{ color } c] = \frac{1-\varepsilon}{\Lambda}$



Initialize $P_{e,c} \leftarrow \frac{1-\varepsilon}{\Delta}$ for each color $c \in \{1, 2 \dots, \Delta\}$

When e arrives:

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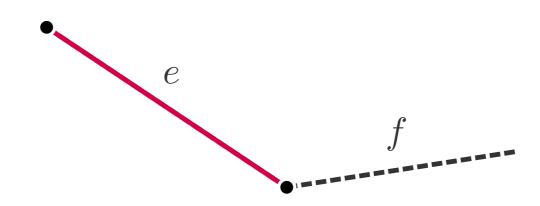
Sample color c from $(P_{e,1}, P_{e,2}, \dots, P_{e,\Delta}, 1 - \sum_{c} P_{e,c})$

For potential future incident edges f:

Need to set $P_{f,c}^{\text{new}} \leftarrow 0$ Update $P_{f,k}^{\text{new}} \leftarrow P_{f,k}^{\text{old}} \cdot \frac{1}{1 - P_{e,k}}$ for all colors $k \neq c$

Focus on arriving edge e

Goal: $\Pr[\text{we assign } e \text{ color } c] = \frac{1-\varepsilon}{\Delta}$



Initialize $P_{e,c} \leftarrow \frac{1-\varepsilon}{\Delta}$ for each color $c \in \{1, 2, \ldots, \Delta\}$

When e arrives:

Sample color c from $(P_{e,1}, P_{e,2}, \dots, P_{e,\Delta}, 1 - \sum_{c} P_{e,c})$

For potential future incident edges f:

Need to set $P_{f,c}^{\text{new}} \leftarrow 0$

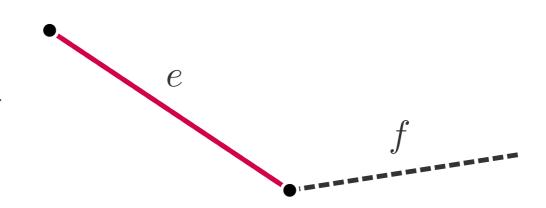
Update $P_{f,k}^{\text{new}} \leftarrow P_{f,k}^{\text{old}} \cdot \frac{1}{1 - P_{e,k}}$ for all colors $k \neq c$

Pr left uncolored → emergency palette

"Bayesian update"
$$\begin{aligned}
& \text{Pr}[f \text{ col } k] = \\
& = \Pr[f \text{ col } k \mid e \text{ col } k] \Pr[e \text{ col } k] \\
& + \Pr[f \text{ col } k \mid e \text{ not col } k] \Pr[e \text{ not col } k] \\
& = 0 \cdot P_{e,k} + P_{f,k}^{\text{new}} \cdot (1 - P_{e,k}) \\
& = P_{f,k}^{\text{old}}
\end{aligned}$$

Focus on arriving edge e

Goal: $\Pr[\text{we assign } e \text{ color } c] = \frac{1-\varepsilon}{\Delta}$ \Longrightarrow OK



Initialize $P_{e,c} \leftarrow \frac{1-\varepsilon}{\Delta}$ for each color $c \in \{1, 2, \ldots, \Delta\}$

When e arrives:

 \Pr left uncolored \rightarrow emergency palette

Sample color c from $(P_{e,1}, P_{e,2}, \dots, P_{e,\Delta}, 1 - \sum_{c} P_{e,c})$

For potential future incident edges f:

Need to set $P_{f,c}^{\text{new}} \leftarrow 0$

Update $P_{f,k}^{\text{new}} \leftarrow P_{f,k}^{\text{old}} \cdot \frac{1}{1 - P_{e,k}}$ for all colors $k \neq c$

"Bayesian update" $\begin{cases}
\Pr[f \text{ col } k] = \\
= \Pr[f \text{ col } k \mid e \text{ col } k] \Pr[e \text{ col } k] \\
+ \Pr[f \text{ col } k \mid e \text{ not col } k] \Pr[e \text{ not col } k]
\end{cases}$ $= 0 \cdot P_{e,k} + P_{f,k}^{\text{new}} \cdot (1 - P_{e,k})$ $= P_{f,k}^{\text{old}}$

Focus on arriving edge \boldsymbol{e}

Goal: $\Pr[\text{we assign } e \text{ color } c] = \frac{1-\varepsilon}{\Delta}$ \Longrightarrow OK



Initialize $P_{e,c} \leftarrow \frac{1-\varepsilon}{\Delta}$ for each color $c \in \{1, 2, \ldots, \Delta\}$

When e arrives:

Sample color c from $(P_{e,1}, P_{e,2}, \dots, P_{e,\Delta}, 1 - \sum_{c} P_{e,c})$

For potential future incident edges f:

Need to set $P_{f,c}^{\text{new}} \leftarrow 0$

Update $P_{f,k}^{\text{new}} \leftarrow P_{f,k}^{\text{old}} \cdot \frac{1}{1 - P_{g,k}}$ for all colors $k \neq c$

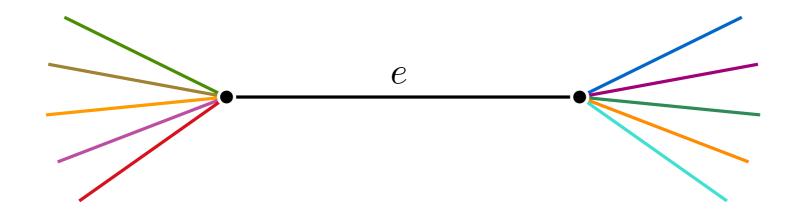
Pr left uncolored → emergency palette

"Bayesian update"
$$\begin{aligned}
&\left\{ \begin{array}{l} \Pr[f \text{ col } k] = \\ &= \Pr[f \text{ col } k \mid e \text{ col } k] \Pr[e \text{ col } k] \\ &+ \Pr[f \text{ col } k \mid e \text{ not col } k] \Pr[e \text{ not col } k] \end{aligned} \right.$$

$$= 0 \cdot P_{e,k} + P_{f,k}^{\text{new}} \cdot (1 - P_{e,k}) \\ &= P_{f,k}^{\text{old}}$$

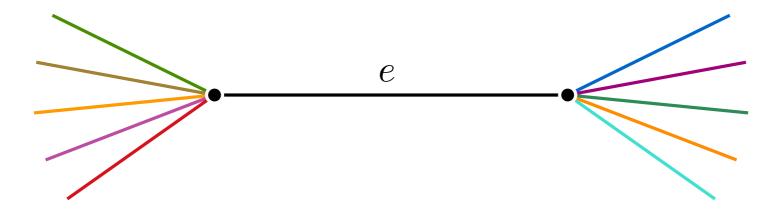
Use palette $\{1, 2, \dots, (1 + \varepsilon)\Delta\}$

Color arriving edge e with an available color uniformly at random



Use palette $\{1, 2, \dots, (1 + \varepsilon)\Delta\}$

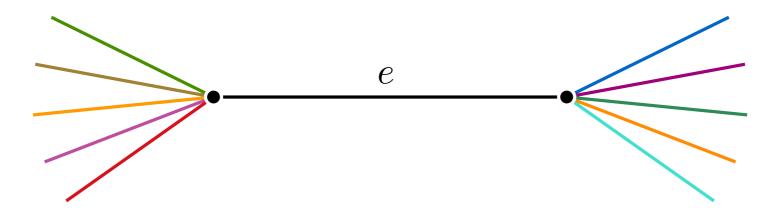
Color arriving edge e with an available color uniformly at random



Does it work? (fail if no available color)

Use palette $\{1, 2, \dots, (1 + \varepsilon)\Delta\}$

Color arriving edge e with an available color uniformly at random

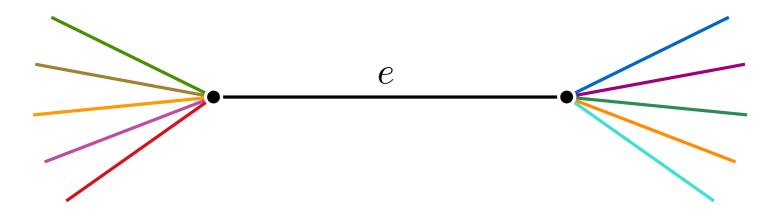


Does it work? (fail if no available color)

NO! two subtle problematic reasons:

Use palette $\{1, 2, \dots, (1 + \varepsilon)\Delta\}$

Color arriving edge e with an available color uniformly at random



Does it work? (fail if no available color)

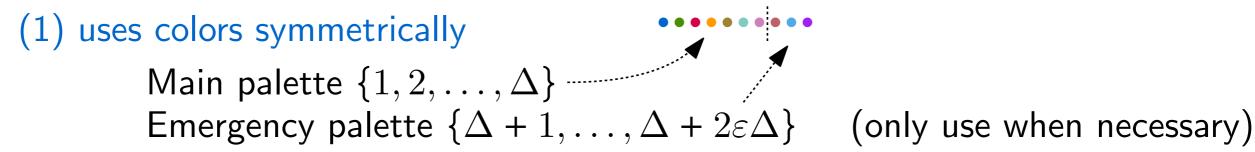
NO! two subtle problematic reasons:

- (1) uses colors symmetrically (even fails in trees)
- (2) "uniformly at random" allows adversary to amplify bias

Two subtle problematic reasons:

(1) uses colors symmetrically

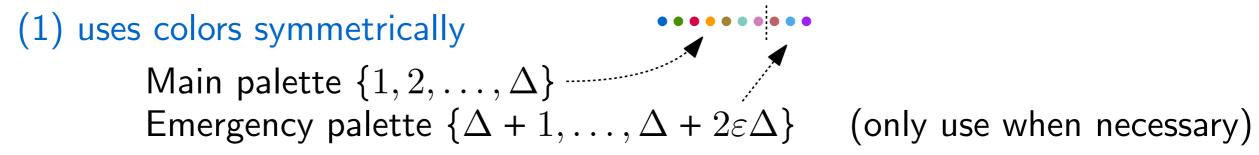
Two subtle problematic reasons:



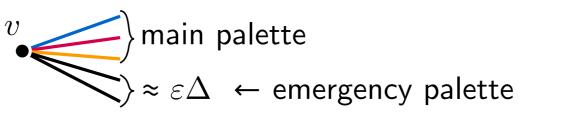
Two subtle problematic reasons:

Goal: $\Pr[\text{we assign } e \text{ color from main palette}] = 1 - \varepsilon$

Two subtle problematic reasons:



Goal: $\Pr[\text{we assign } e \text{ color from main palette}] = 1 - \varepsilon$



Two subtle problematic reasons:

Emergency palette $\{\Delta + 1, \dots, \Delta + 2\varepsilon\Delta\}$ (only use when necessary)

Goal: $\Pr[\text{we assign } e \text{ color from main palette}] = 1 - \varepsilon$

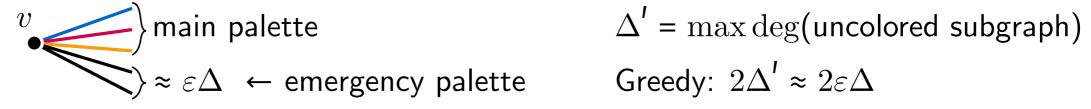


$$\Delta' = \max \deg(\text{uncolored subgraph})$$

Greedy:
$$2\Delta' \approx 2\varepsilon\Delta$$

Two subtle problematic reasons:

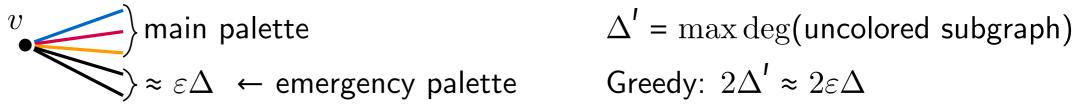
Goal: $\Pr[\text{we assign } e \text{ color from main palette}] = 1 - \varepsilon$



(2) "uniformly at random" allows adversary to amplify bias

Two subtle problematic reasons:

Goal: $\Pr[\text{we assign } e \text{ color from main palette}] = 1 - \varepsilon$



(2) "uniformly at random" allows adversary to amplify bias

Use a Bayesian "execution dependent" approach