

# Distributed Edge Coloring in Time

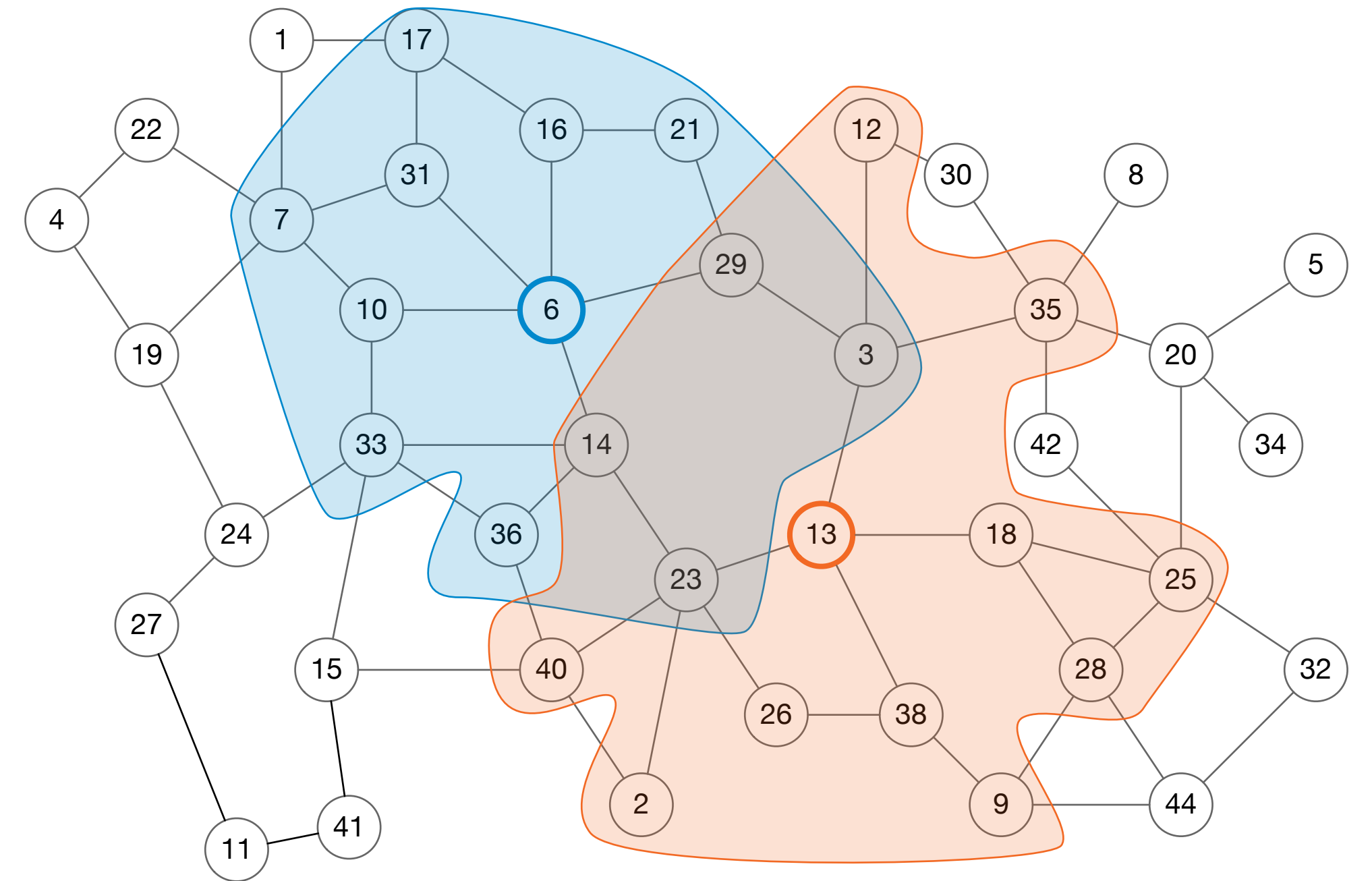
## Quasi-Polylogarithmic in Delta

Alkida Balliu, Fabian Kuhn, **Dennis Olivetti**

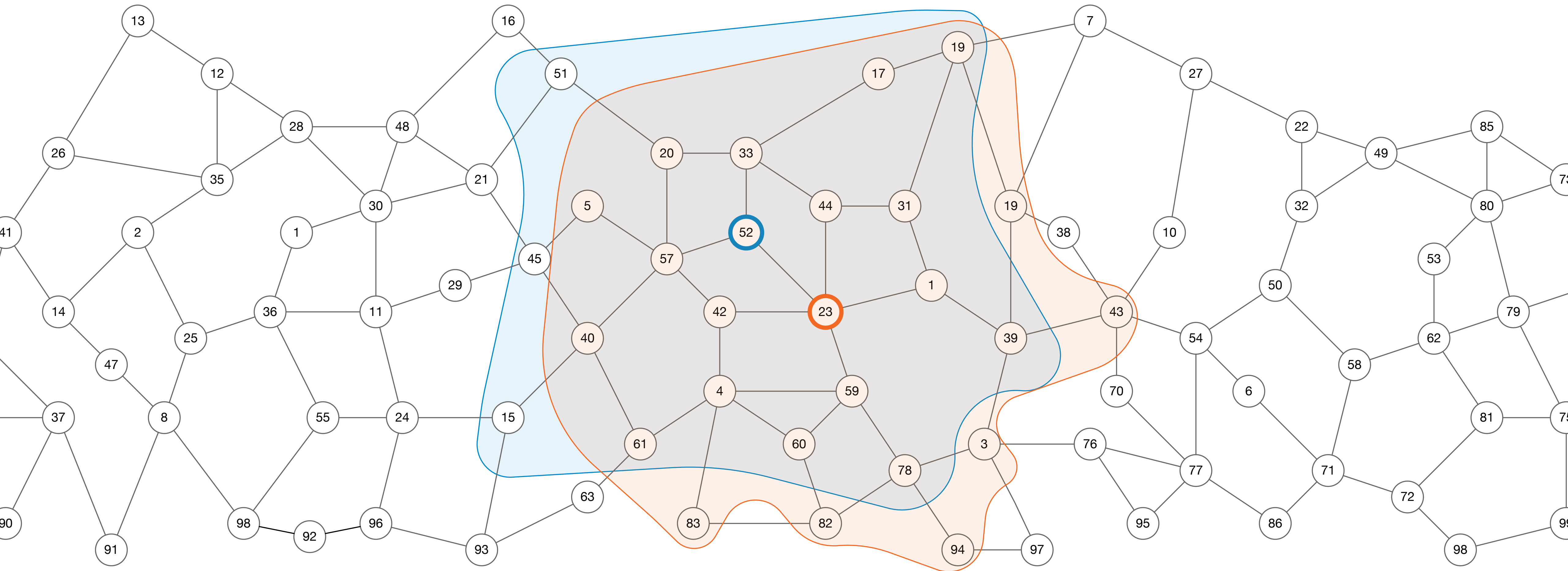
University of Freiburg, Germany

# LOCAL model

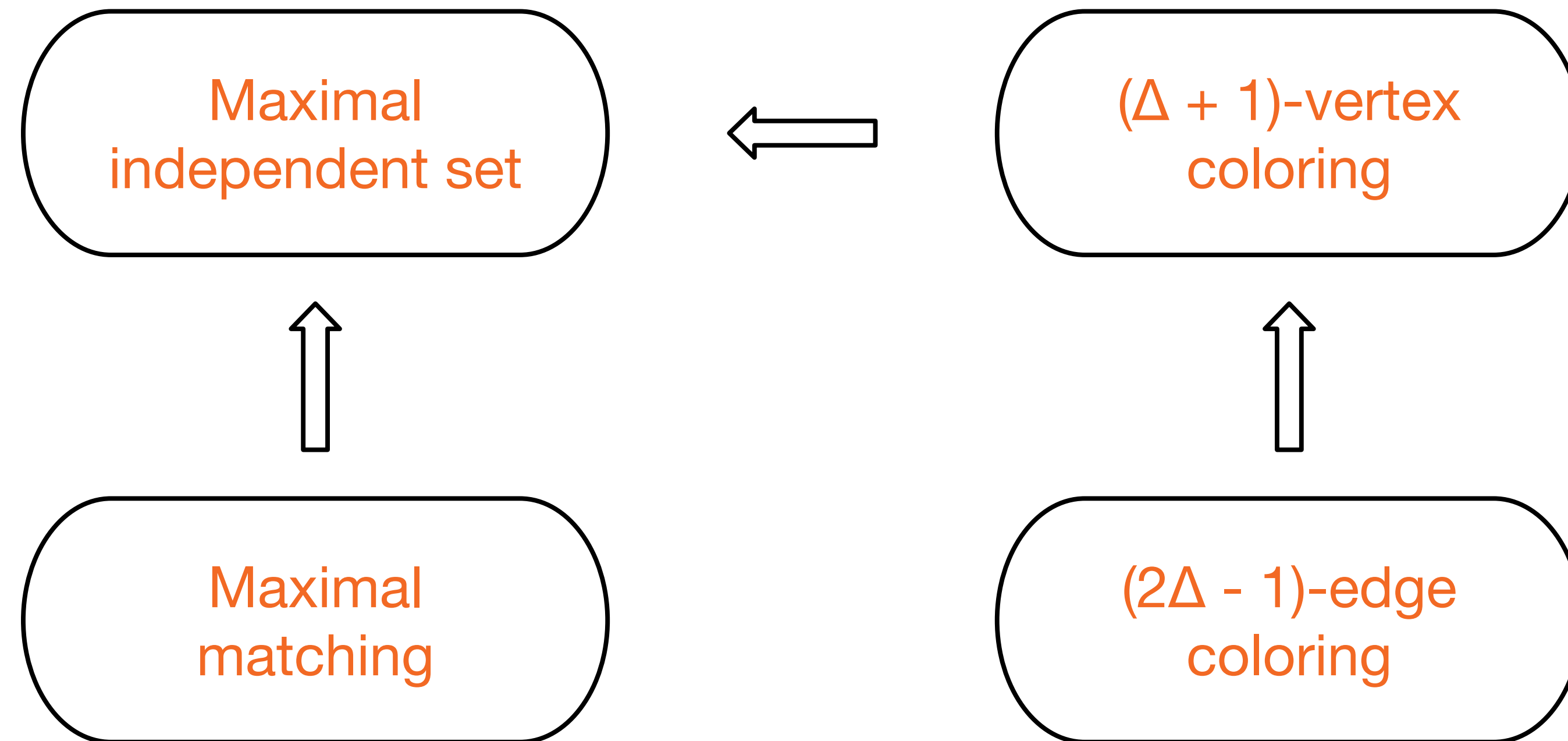
- Undirected simple graph  $G = (V, E)$  of  $n$  nodes and maximum degree  $\Delta$
- Each node has a **unique ID**
- **Synchronous** message passing model
- **Unbounded** computation
- **Unbounded** bandwidth
- Focus on **locality**: time = number of rounds = distance



# LOCAL model: symmetry breaking

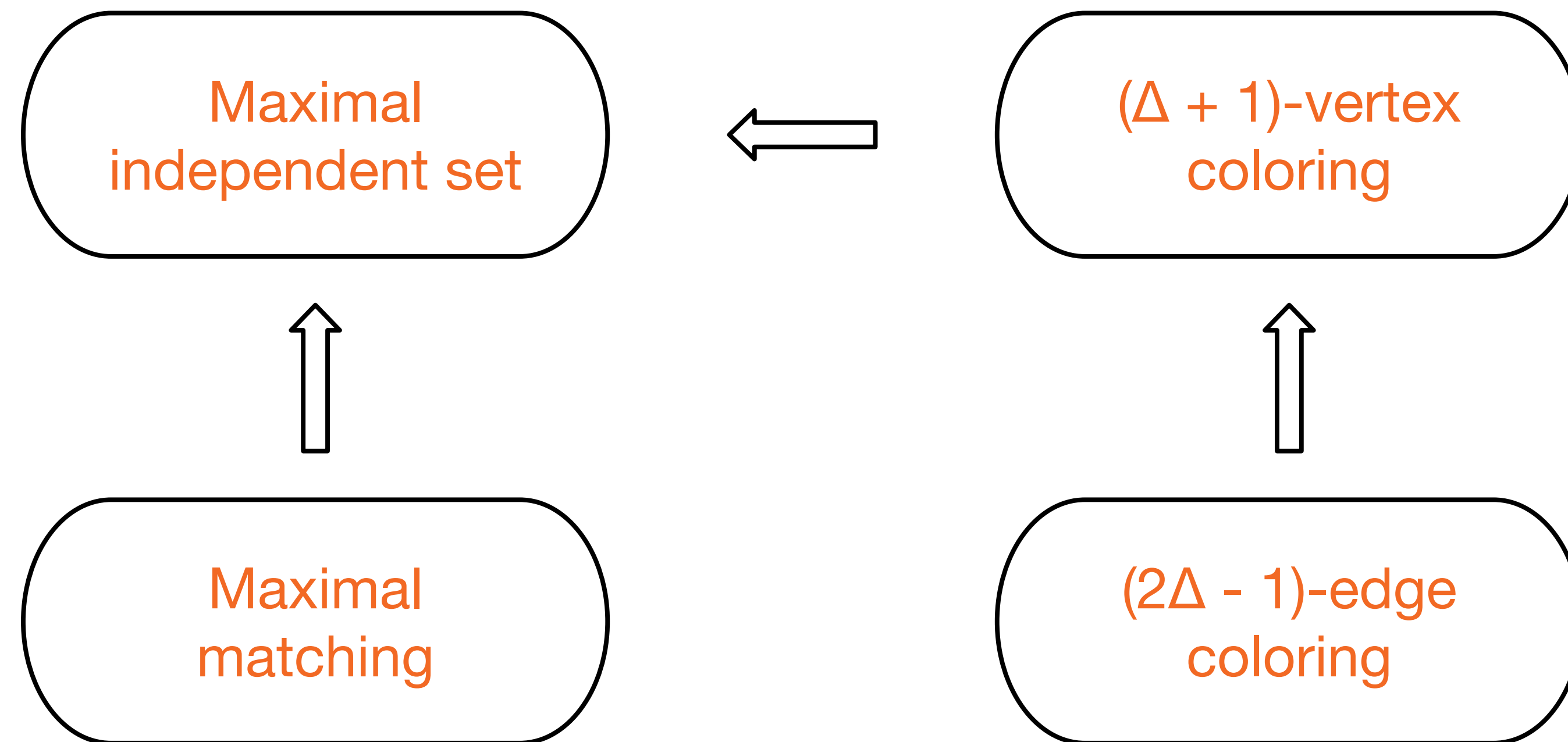


# Four classical problems



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These problems can be solved in  $\text{poly}(\log n)$  rounds [Rozhon, Ghaffari '20]



But, how **local** are these problems?

# Four classical problems: locality

Maximal  
independent set

$$O(\Delta + \log^* n)$$

[Barenboim, Elkin, Kuhn '09]

$$\Omega(\min\{\Delta, \log n / \log \log n\})$$

[Balliu et al. '19]

$$\Omega(\log^* n)$$

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$(\Delta + 1)$ -vertex  
coloring

$$\tilde{O}(\sqrt{\Delta} + \log^* n)$$

[FHK '16][BEG '18][MT '20]

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$$2^{O(\sqrt{\log \Delta})} + O(\log^* n)$$

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# Edge coloring: state of the art

- $(2\Delta - 1)$ -edge coloring (achieved through  $(\Delta + 1)$ -vertex coloring):
  - $O(\Delta + \log^* n)$  [Barenboim, Elkin '09], [Kuhn '09]
  - $O(\Delta^{3/4} + \log^* n)$  [Barenboim '15]
  - $\tilde{O}(\sqrt{\Delta} + \log^* n)$  [Fraigniaud, Heinrich, Kosowski '16] [Barenboim, Elkin, Goldenberg '18] [Maus, Tonoyan '20]
- $O(\Delta)$ -edge coloring:  $O(\Delta^\varepsilon + \log^* n)$  [Barenboim, Elkin '10]
- $(2\Delta - 1)$ -edge coloring in  $2^{O(\sqrt{\log \Delta})} + O(\log^* n)$  [Kuhn '20]

# Our result

$(2\Delta - 1)$ -edge  
coloring

$$2^{O(\log^2 \log \Delta)} + O(\log^* n)$$

[this paper]

$$\Omega(\log^* n)$$

[Linial '87]

# Our result

$(\deg(e) + 1)$ -list edge coloring can be solved in time quasi-polylogarithmic in  $\Delta$

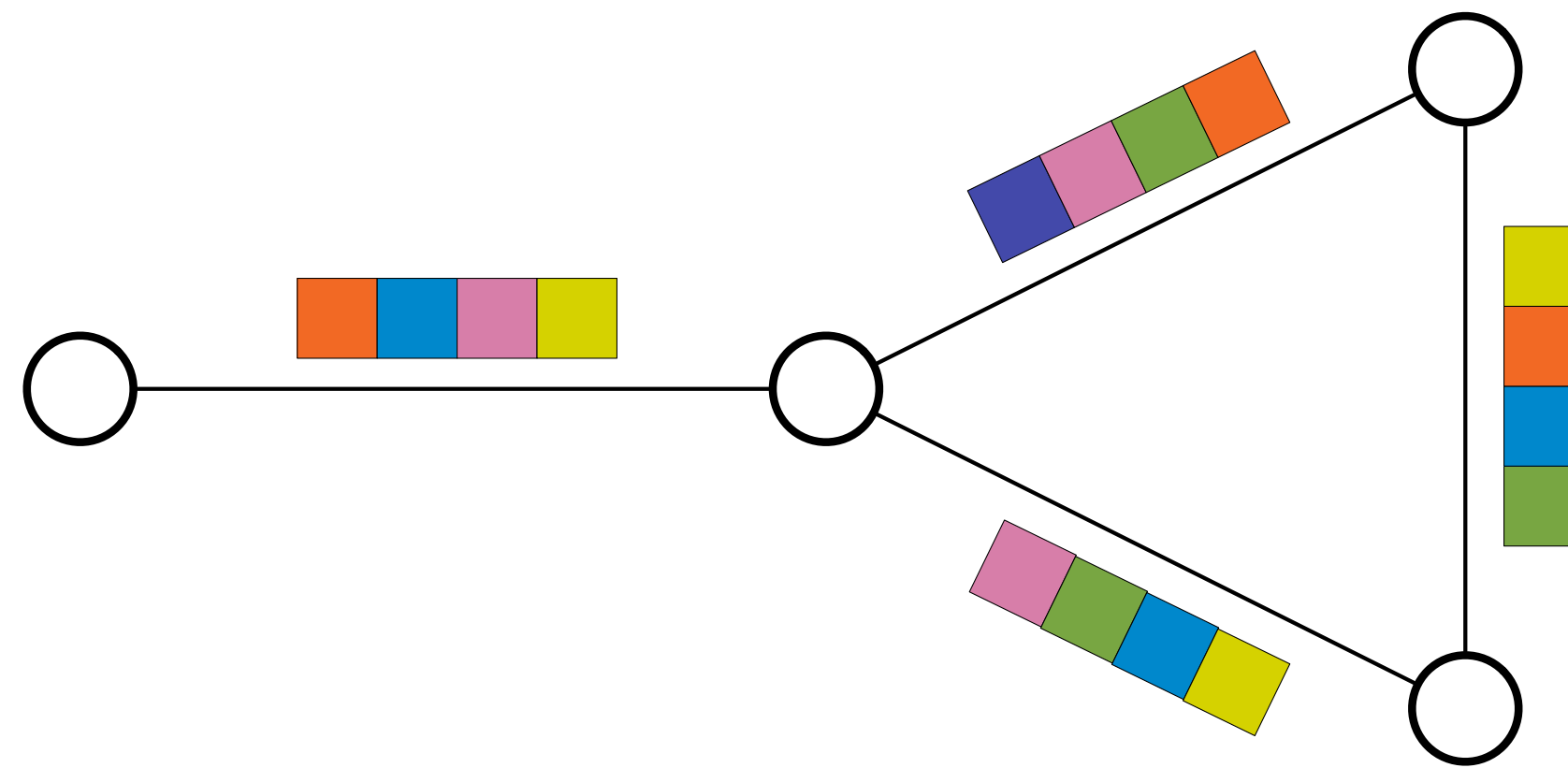
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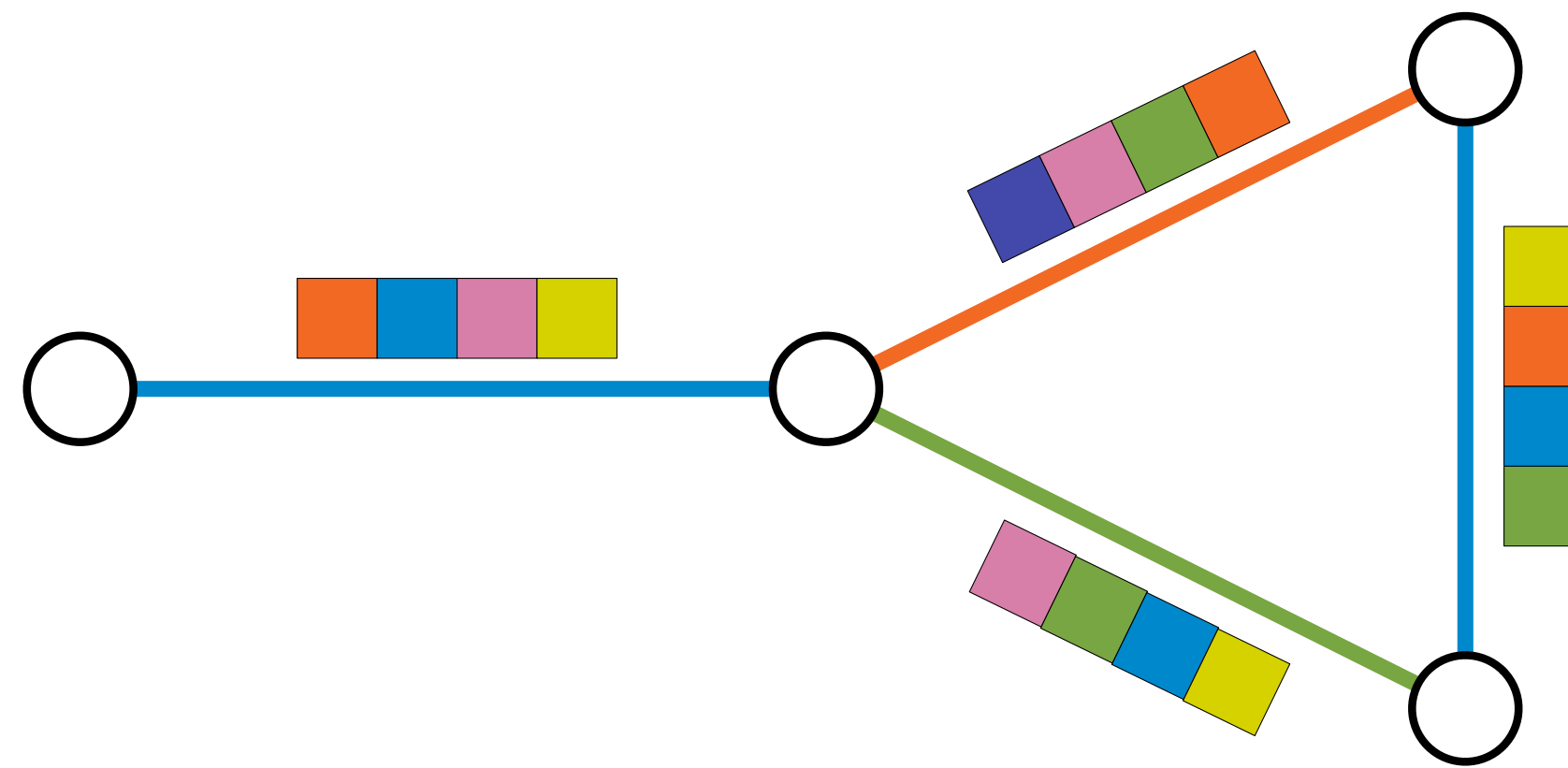
# List edge coloring

Color palette: 



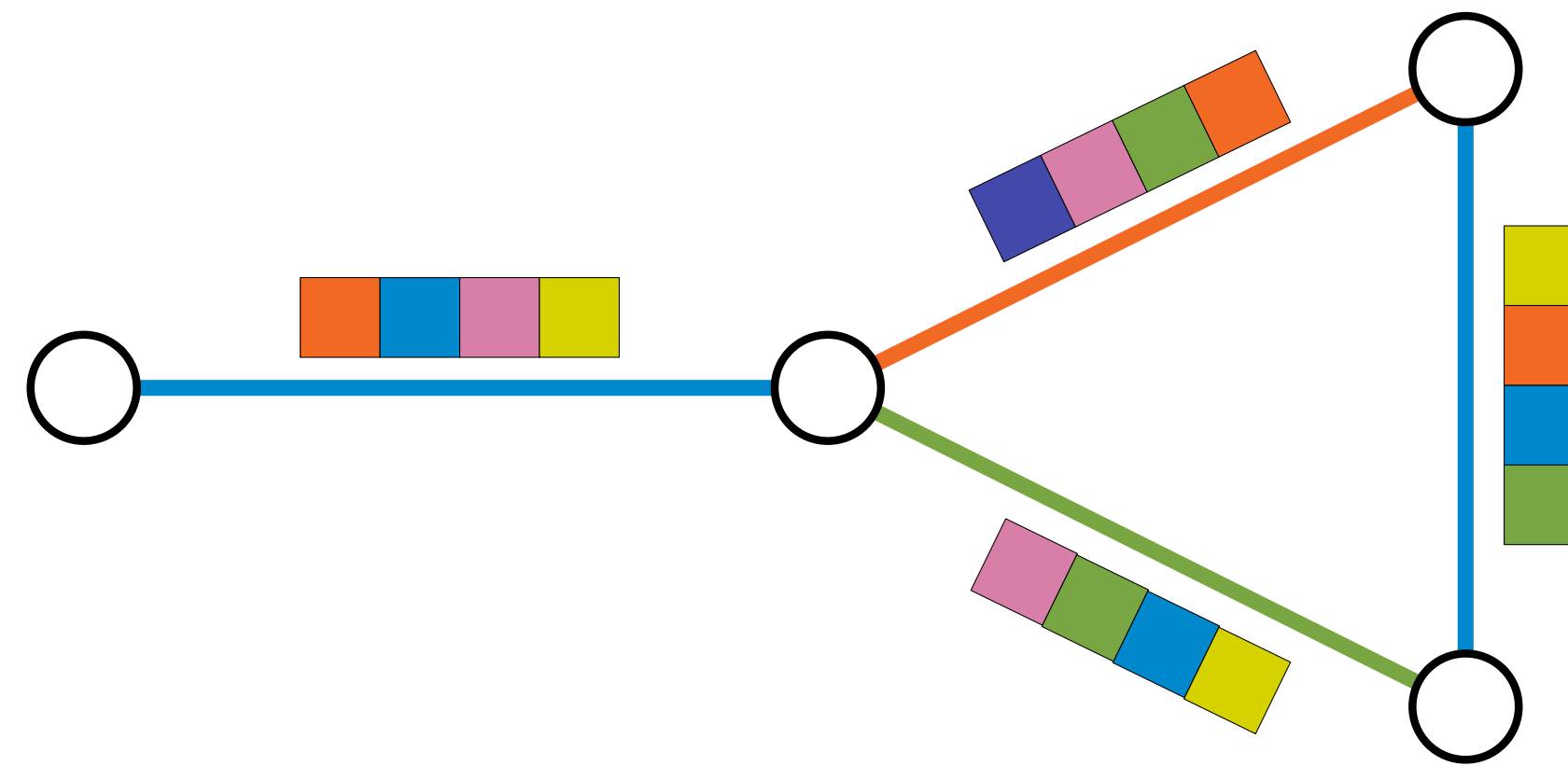
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Color palette: 



# List edge coloring

**(deg(e) + 1)-list edge coloring:** lists of **at least deg(e) + 1 colors**



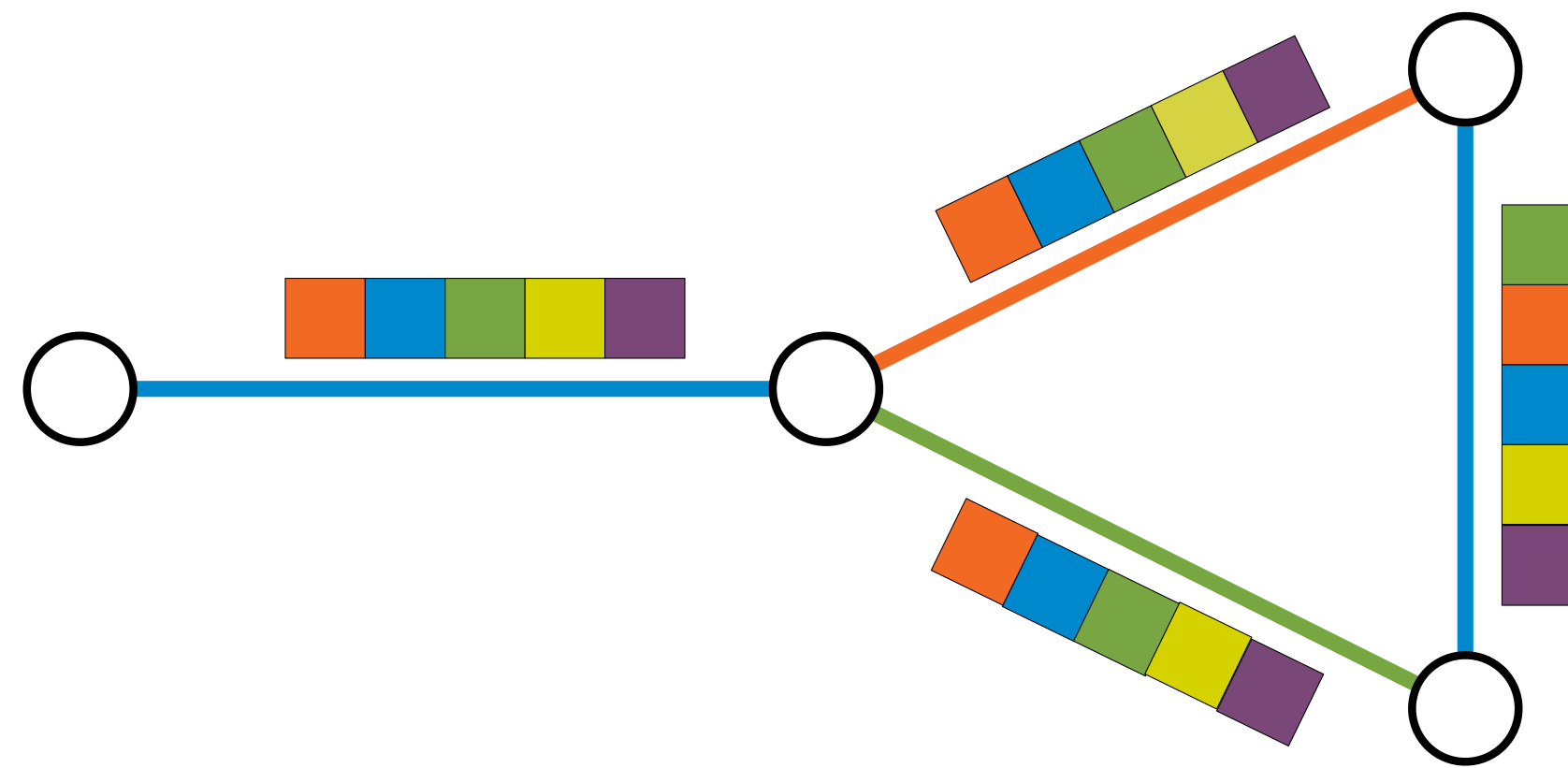


# List edge coloring

- $(2\Delta - 1)$ -edge coloring:

- ▶ lists of  $2\Delta - 1$  colors

- ▶ all lists the same

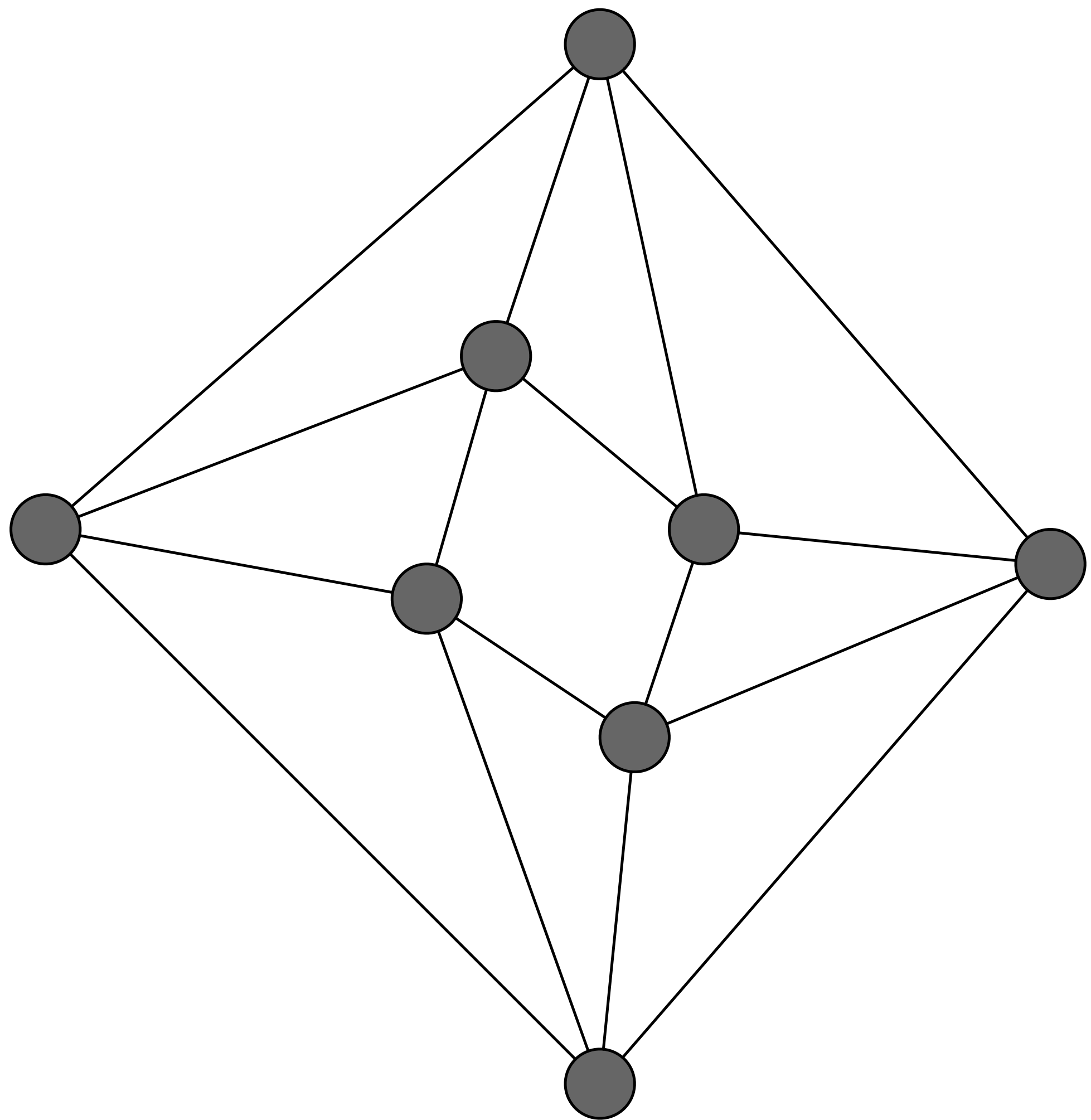


# Why list coloring

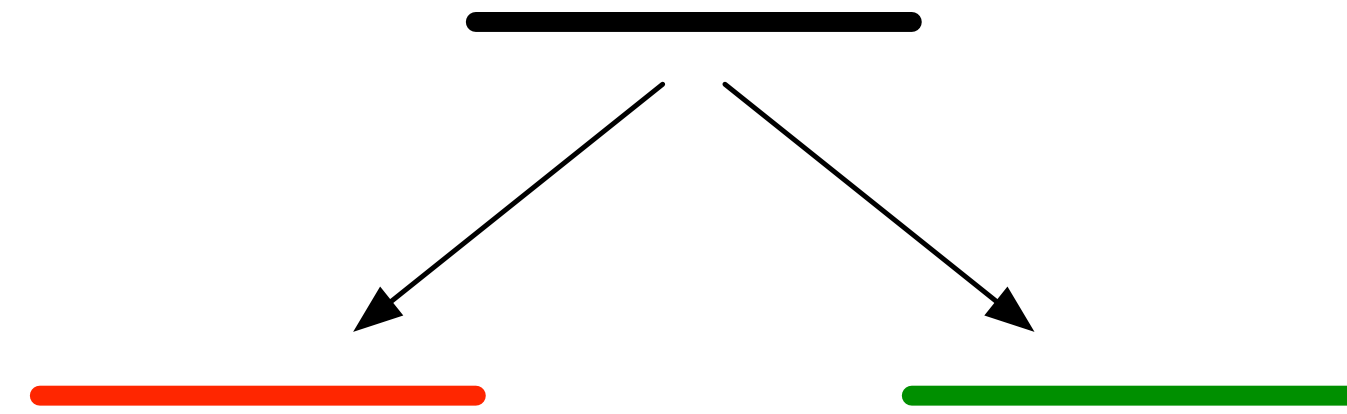
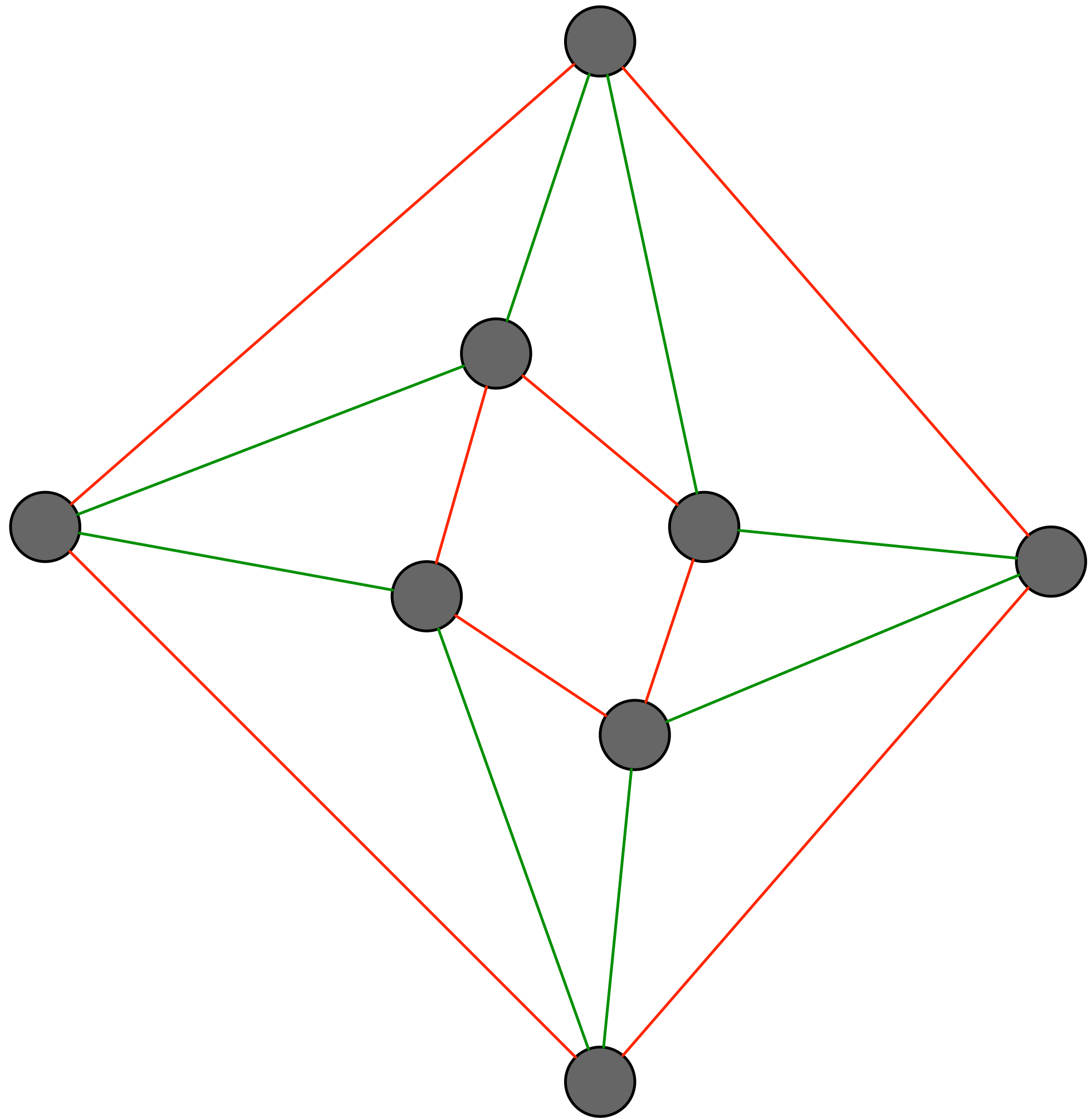
Let's try the following (non list coloring based) algorithm:

- Start from a graph of **maximum degree  $\Delta$**
- **2-color** the edges such that the graph induced by each color has **maximum degree  $\Delta/2$**
- **Recurse** on each subgraph

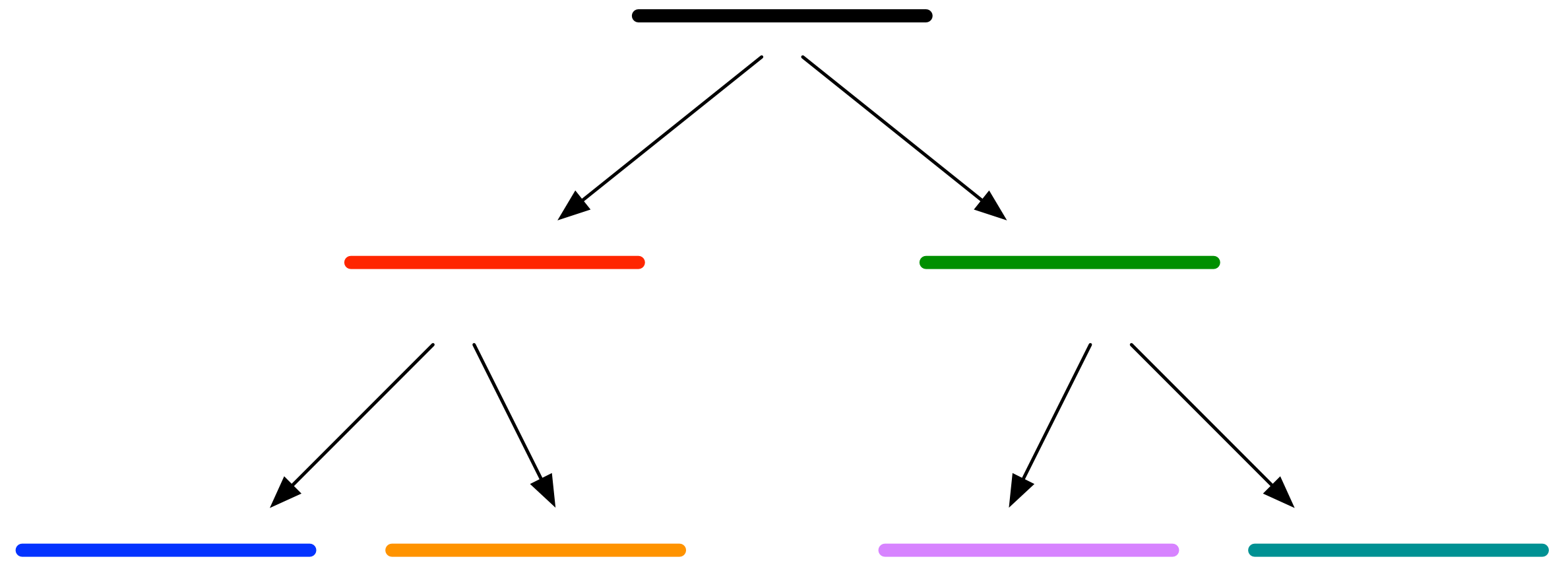
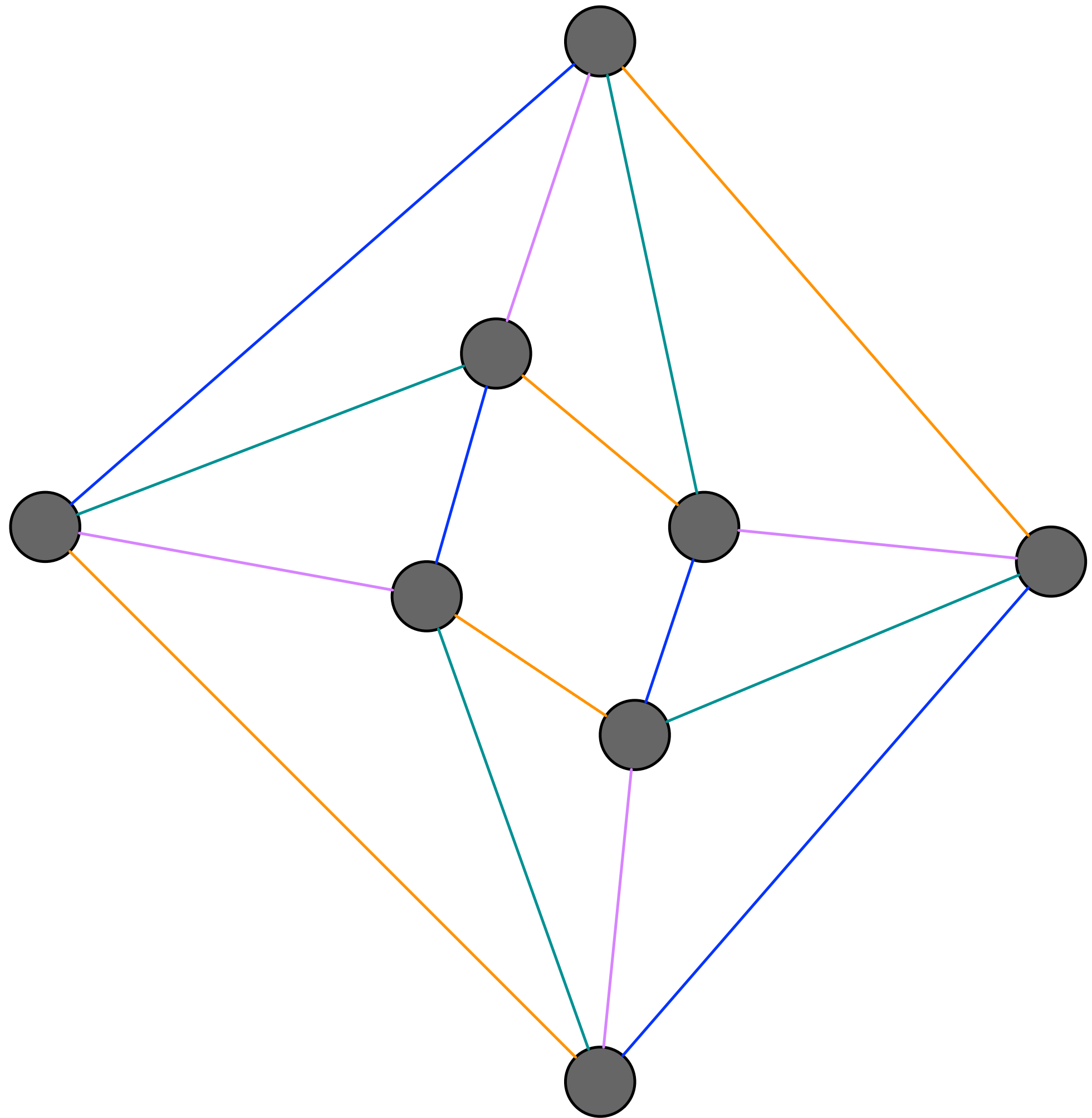
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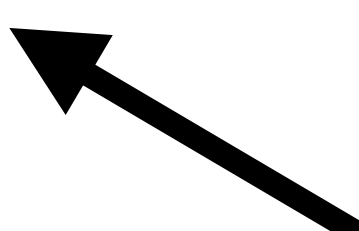
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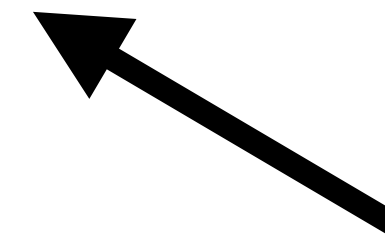
# Why list coloring

- Start from a graph of **maximum degree  $\Delta$**
  - **2-color** the edges such that the graph induced by each color has **maximum degree  $\Delta/2$**
  - **Recurse** on each subgraph
- Too hard
- 

# Why list coloring

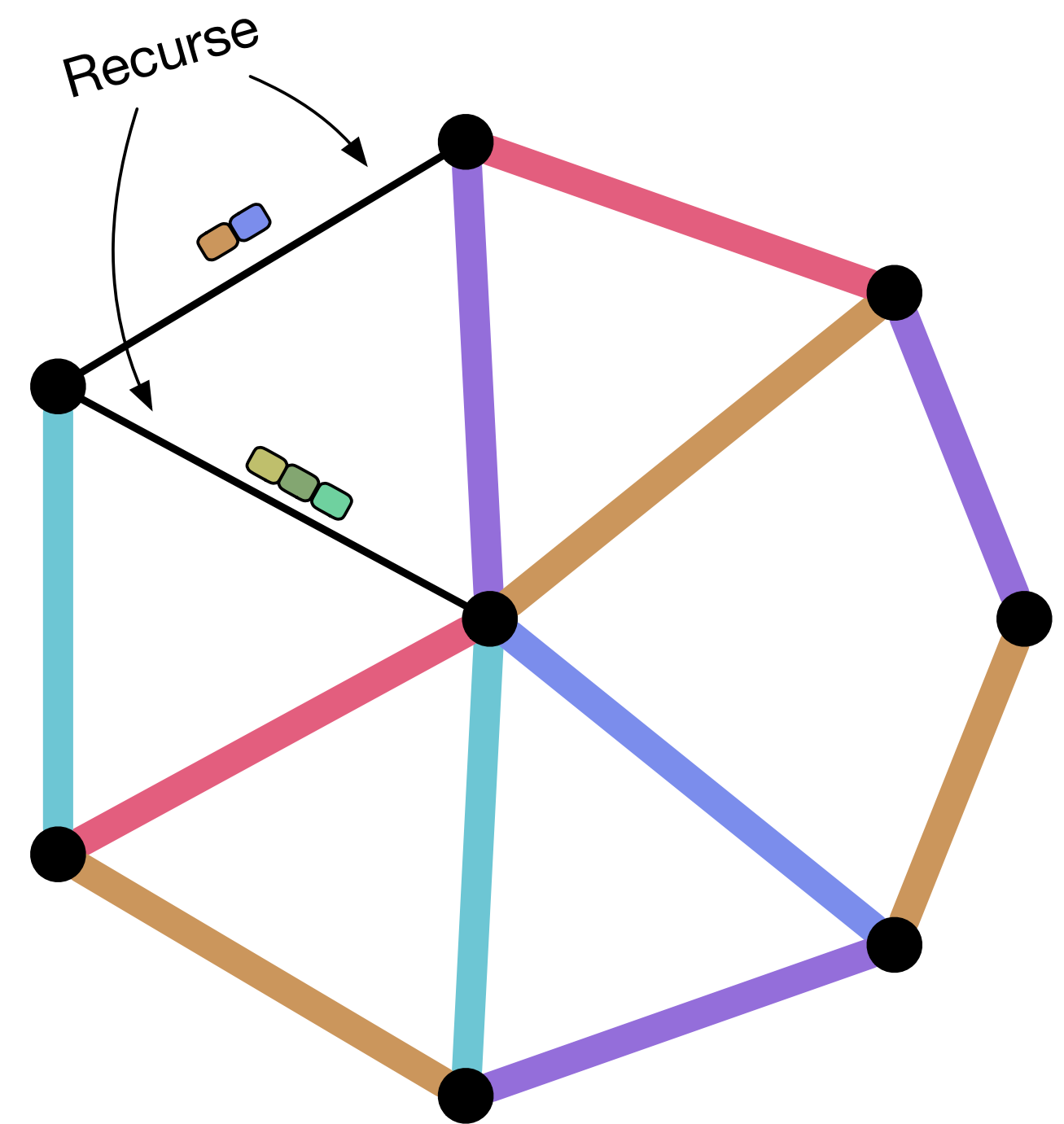
- Start from a graph of **maximum degree  $\Delta$**
- **c-color** the edges such that the graph induced by each color has **maximum degree  $O(\Delta/c)$**
- **Recurse** on each subgraph

**We need too many colors**



# Why list coloring

- **Without lists**, by using a recursive algorithm, we have to **early commit** on color subspaces
- **With lists**, we can color a subgraph and then **recurse** on the remaining uncolored subgraph





**(deg( $e$ ) + 1)-list edge coloring in time**  
 **$(\log \Delta)^{O(\log \log \Delta)} + O(\log^* n)$**

High level ideas

# Definitions

- **Goal:**  $(\deg(e) + 1)$ -list edge coloring
- **Relaxed version:**  $(\beta \times \deg(e) + 1)$ -list edge coloring

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slack 1

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slack  $\beta$

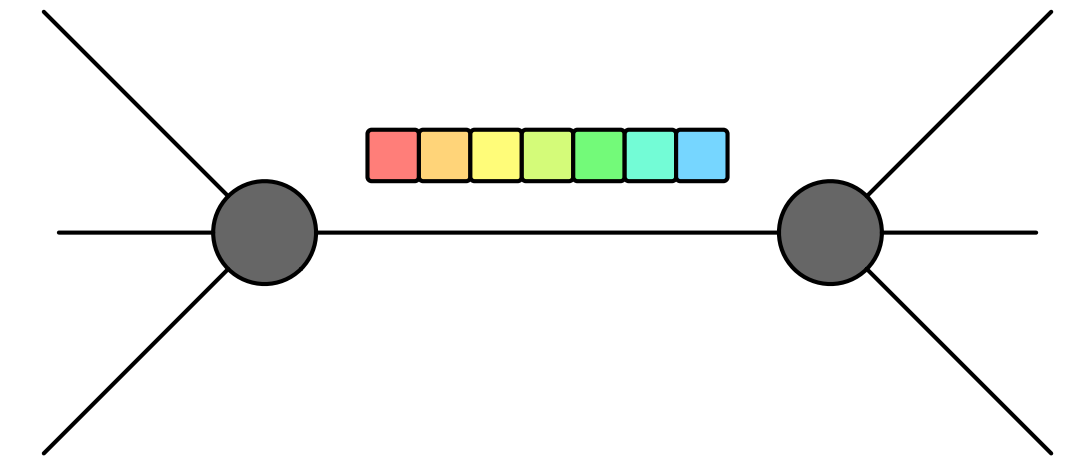
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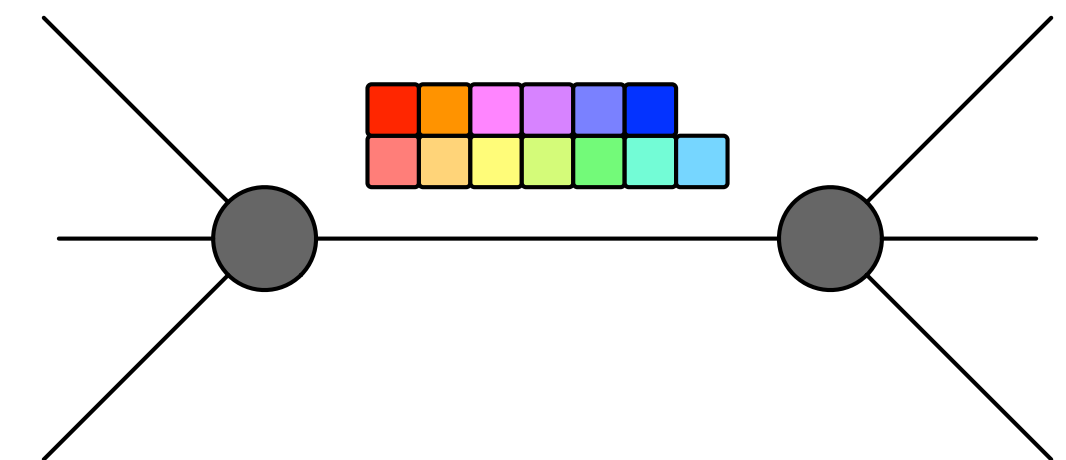
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slack  $\beta$

slack 1:



slack 2:



# Definitions

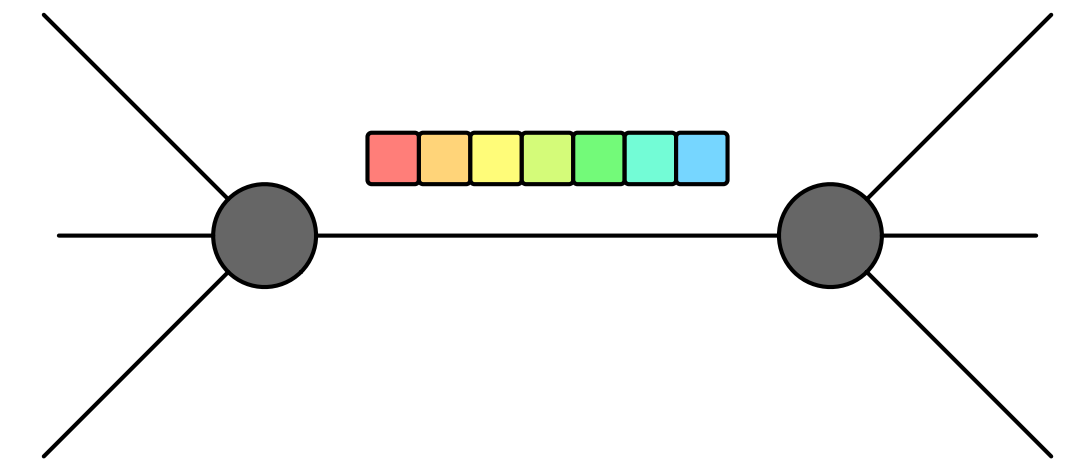
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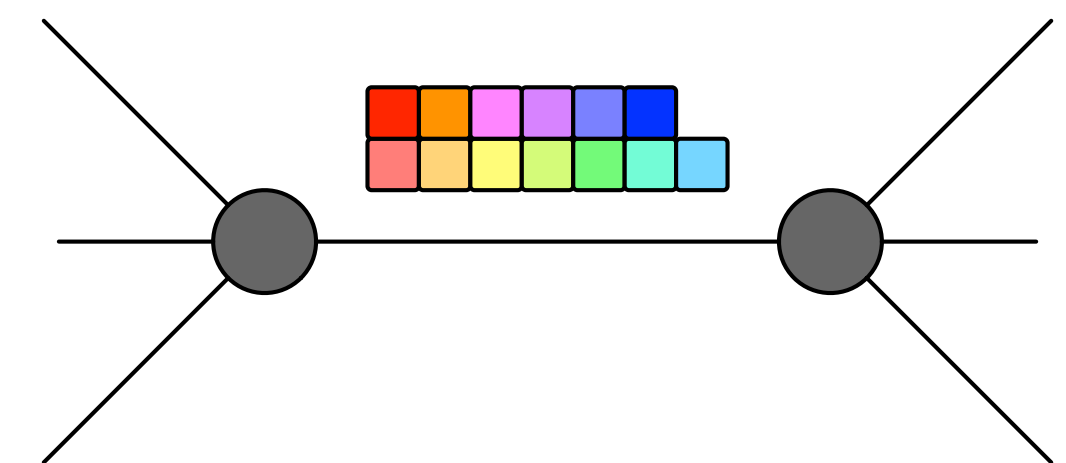
slack  $\beta$

$T(\beta, C)$  = time required to solve a list coloring instance with a palette of size  $C$  and slack  $\beta$

slack 1:



slack 2:



# High level idea

$$T(1, \mathbf{C}) \leq \beta^2 \cdot \log \Delta \cdot T(\beta, \mathbf{C})$$

$$T(\beta, \mathbf{C}) \leq \log p \cdot T(1, \mathbf{p}) + T(\beta/\text{polylog } p, \mathbf{C}/\mathbf{p})$$

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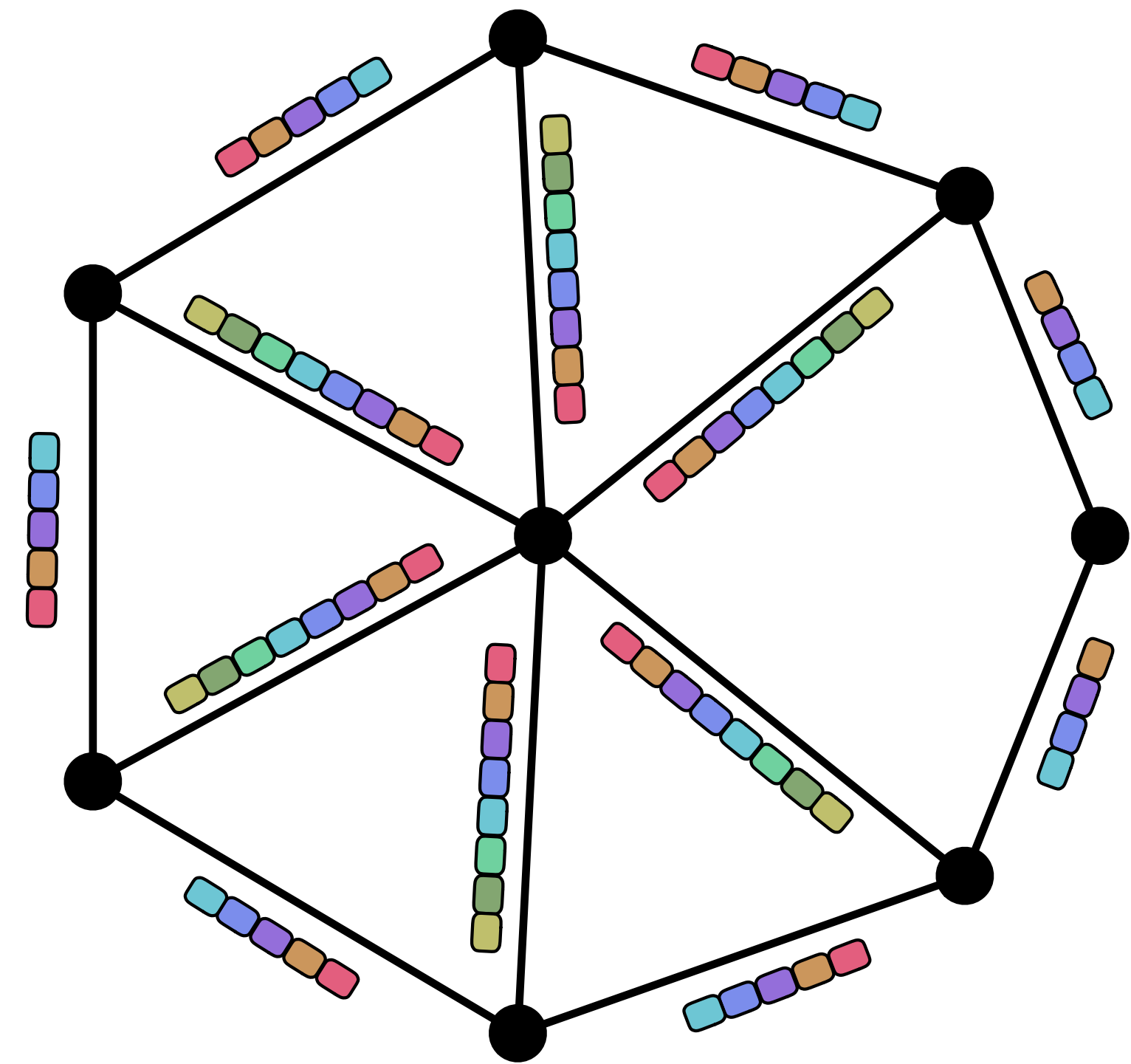
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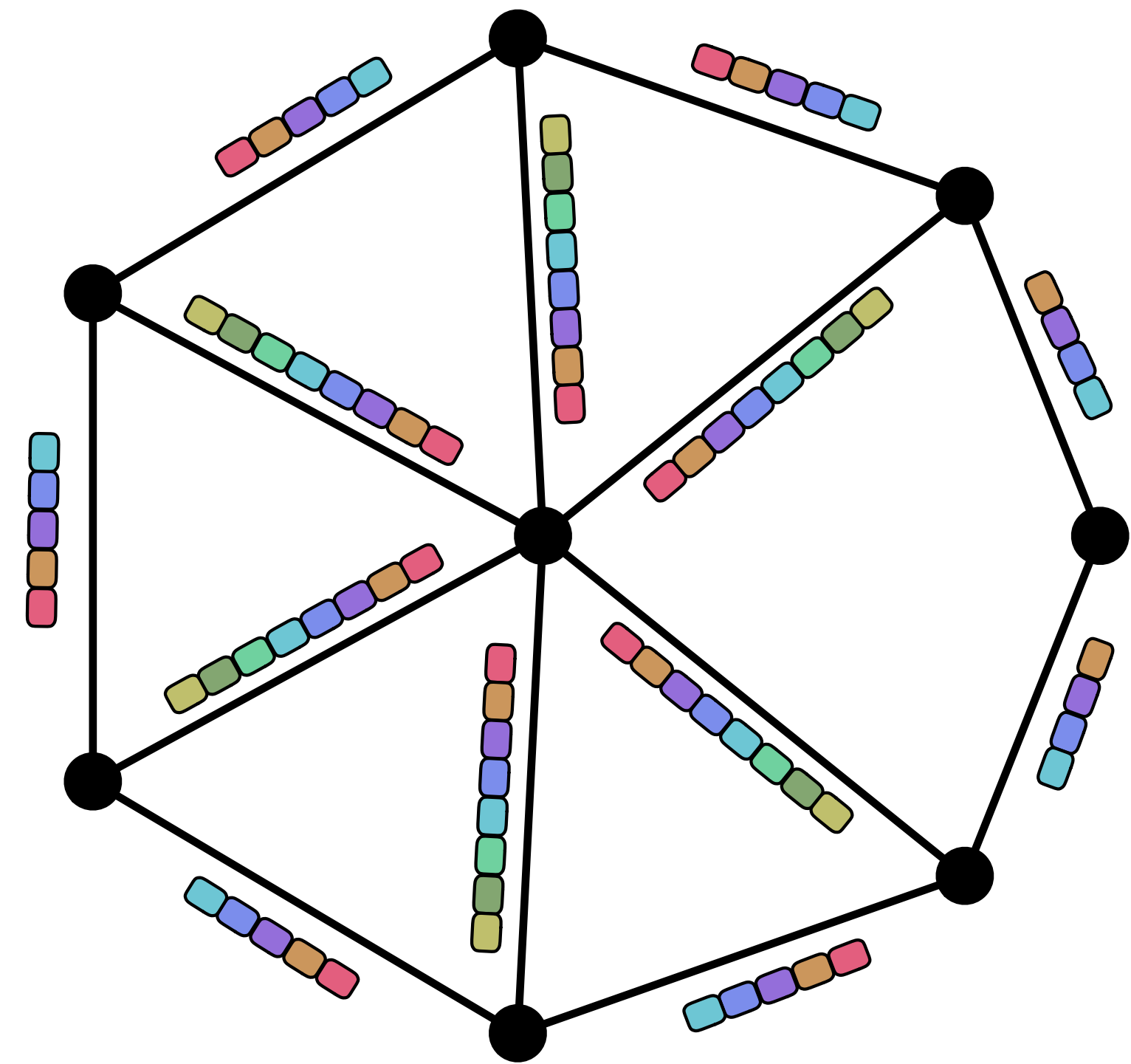
# Increasing the slack

- Suppose we can solve “fast” a list edge coloring with slack  $\beta$



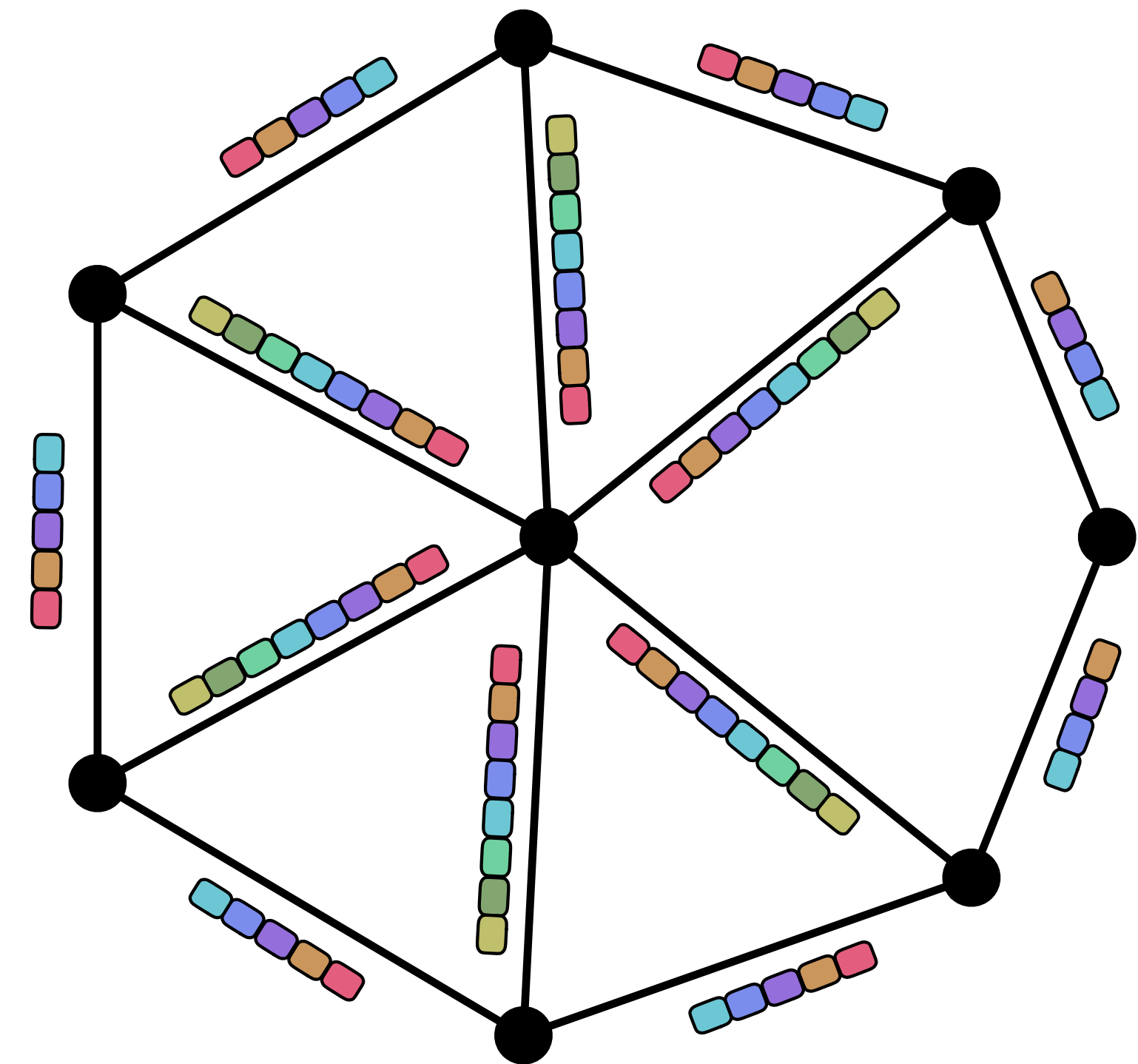
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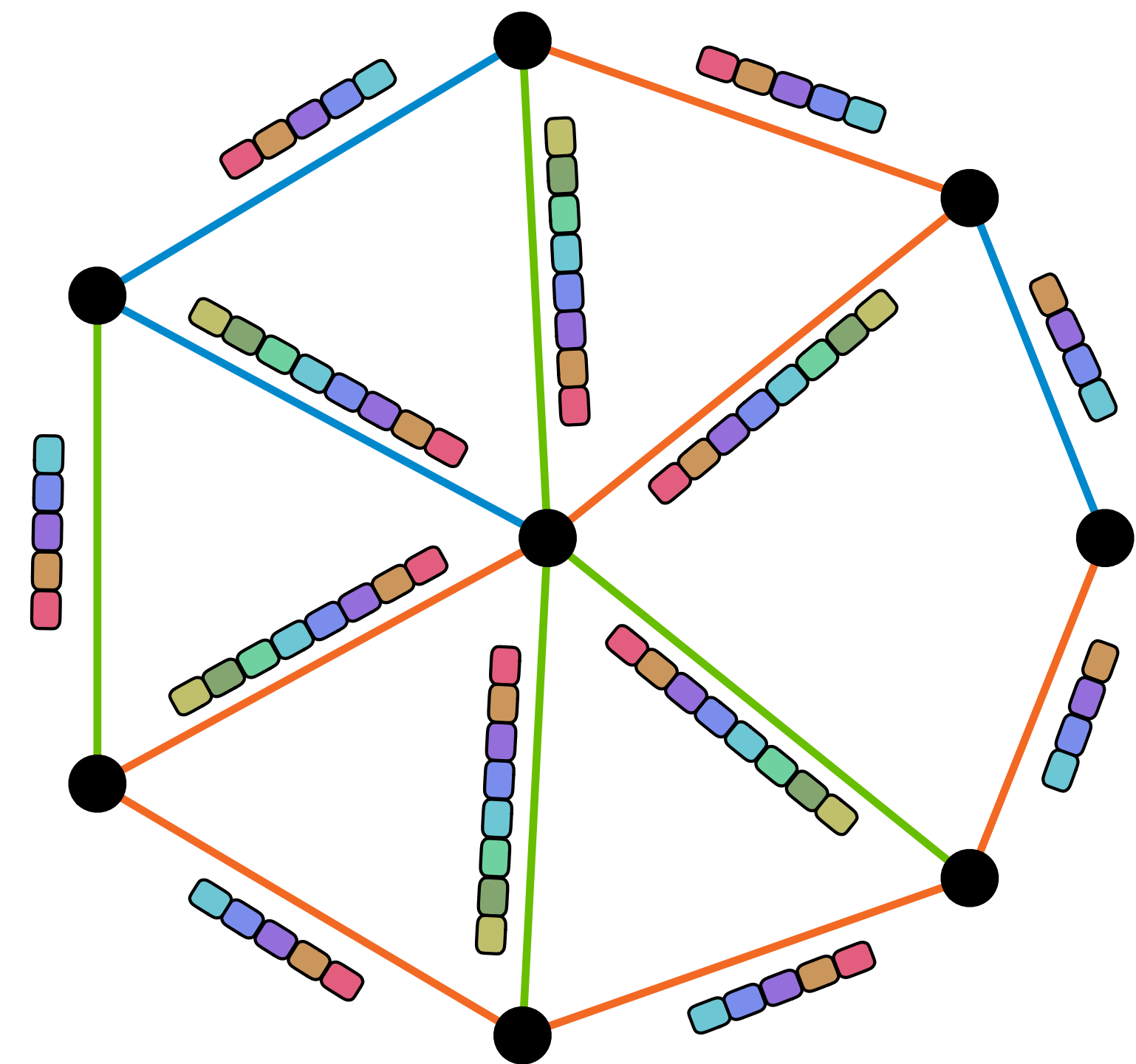
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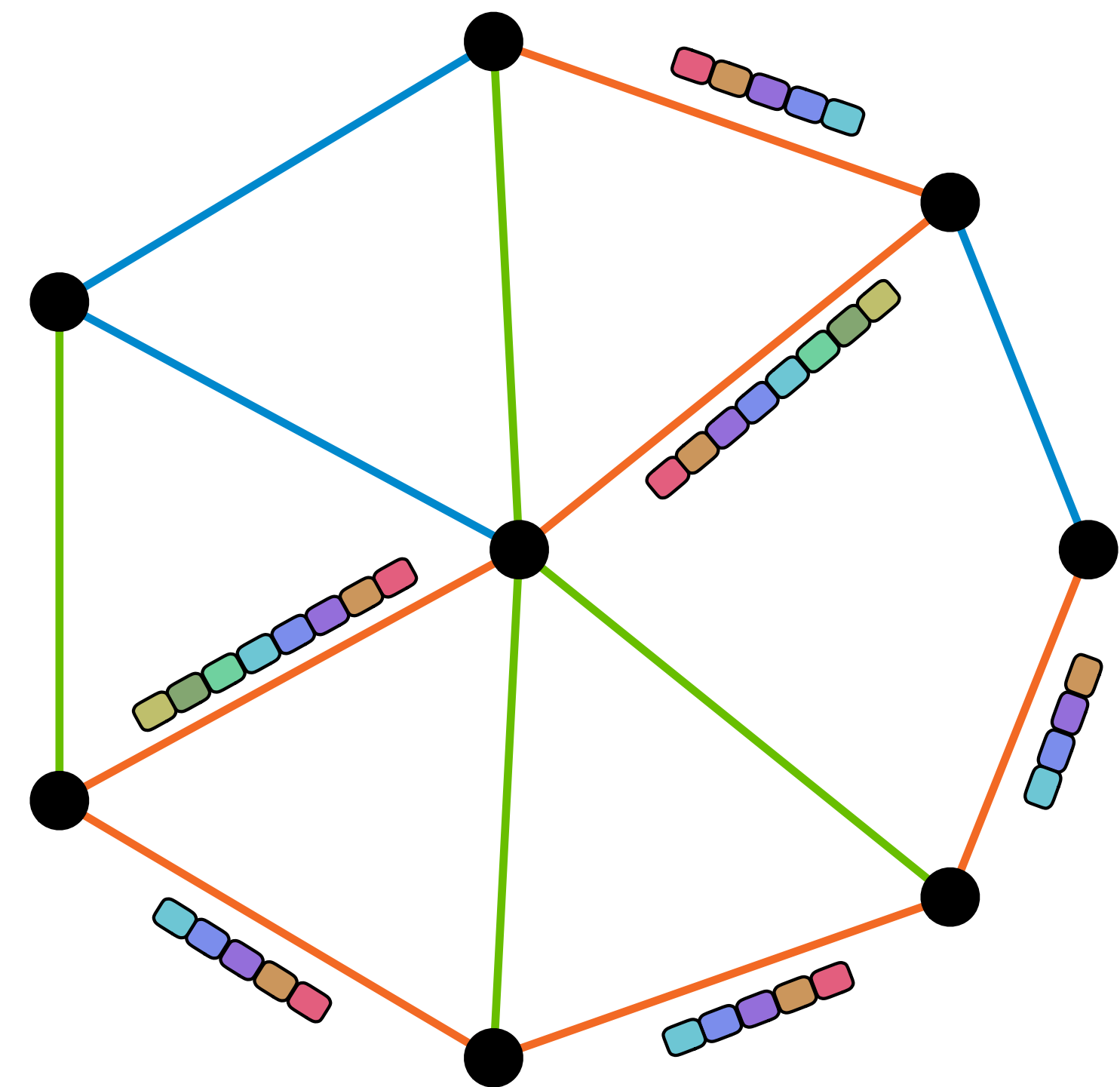
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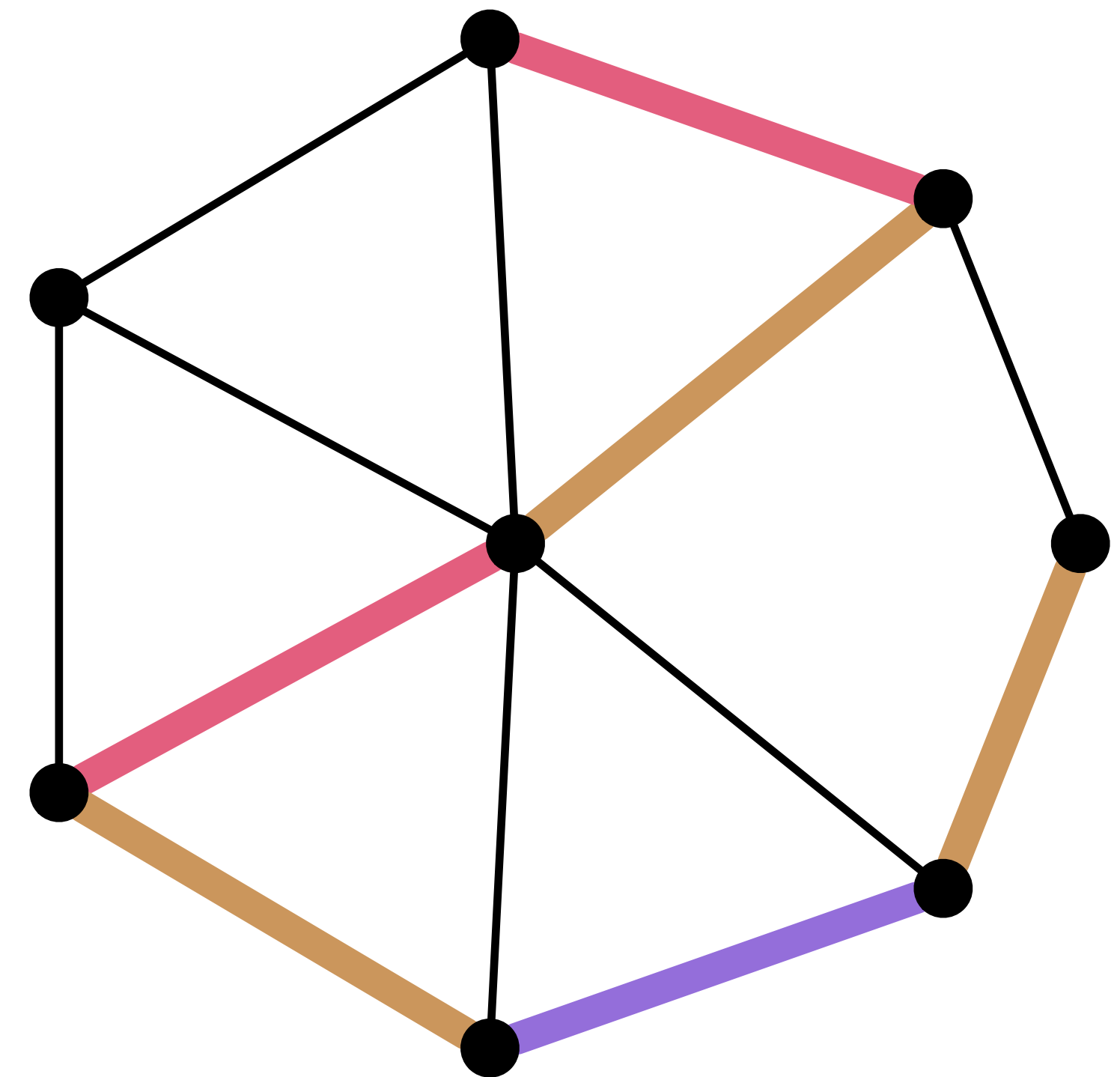
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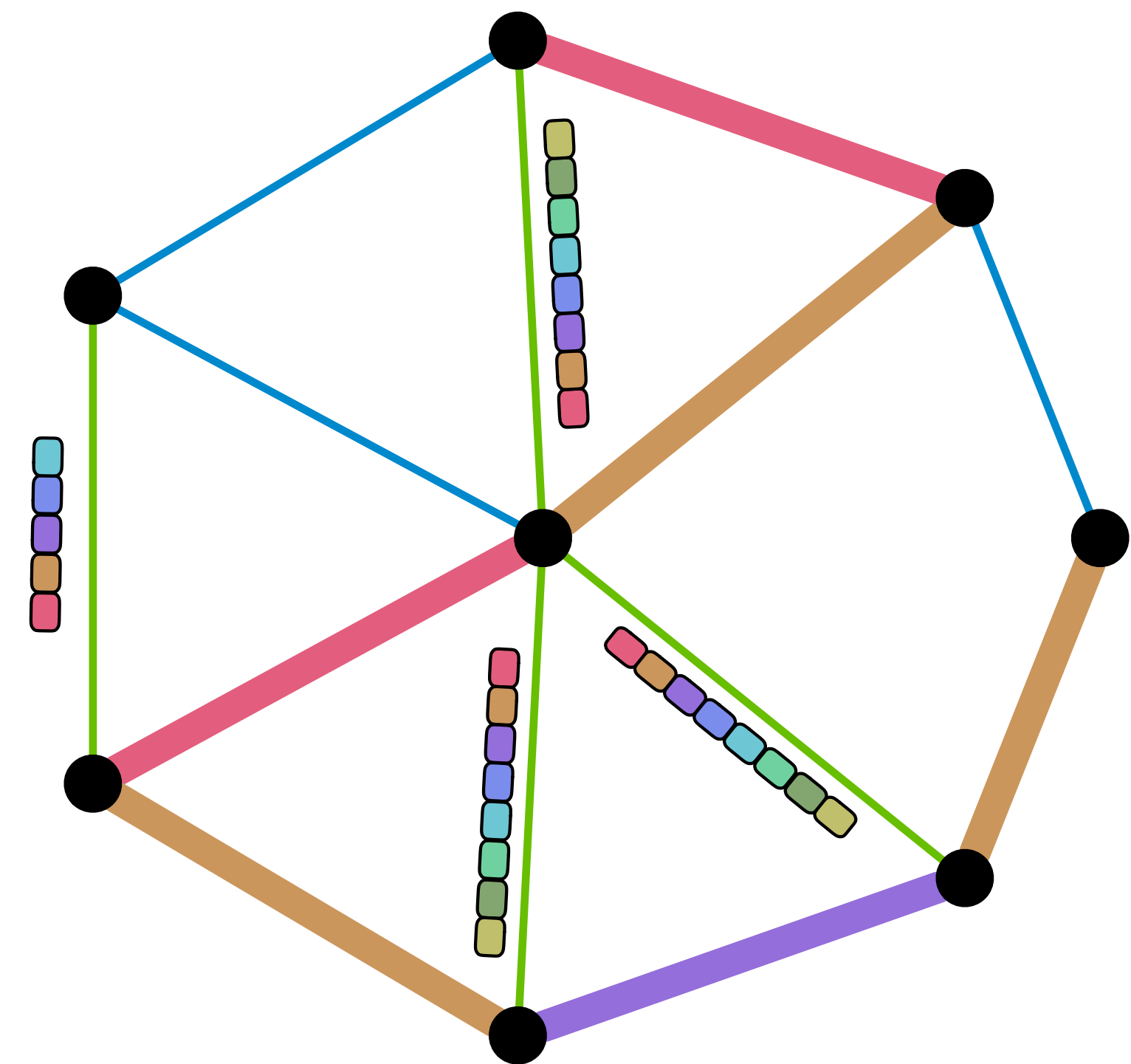
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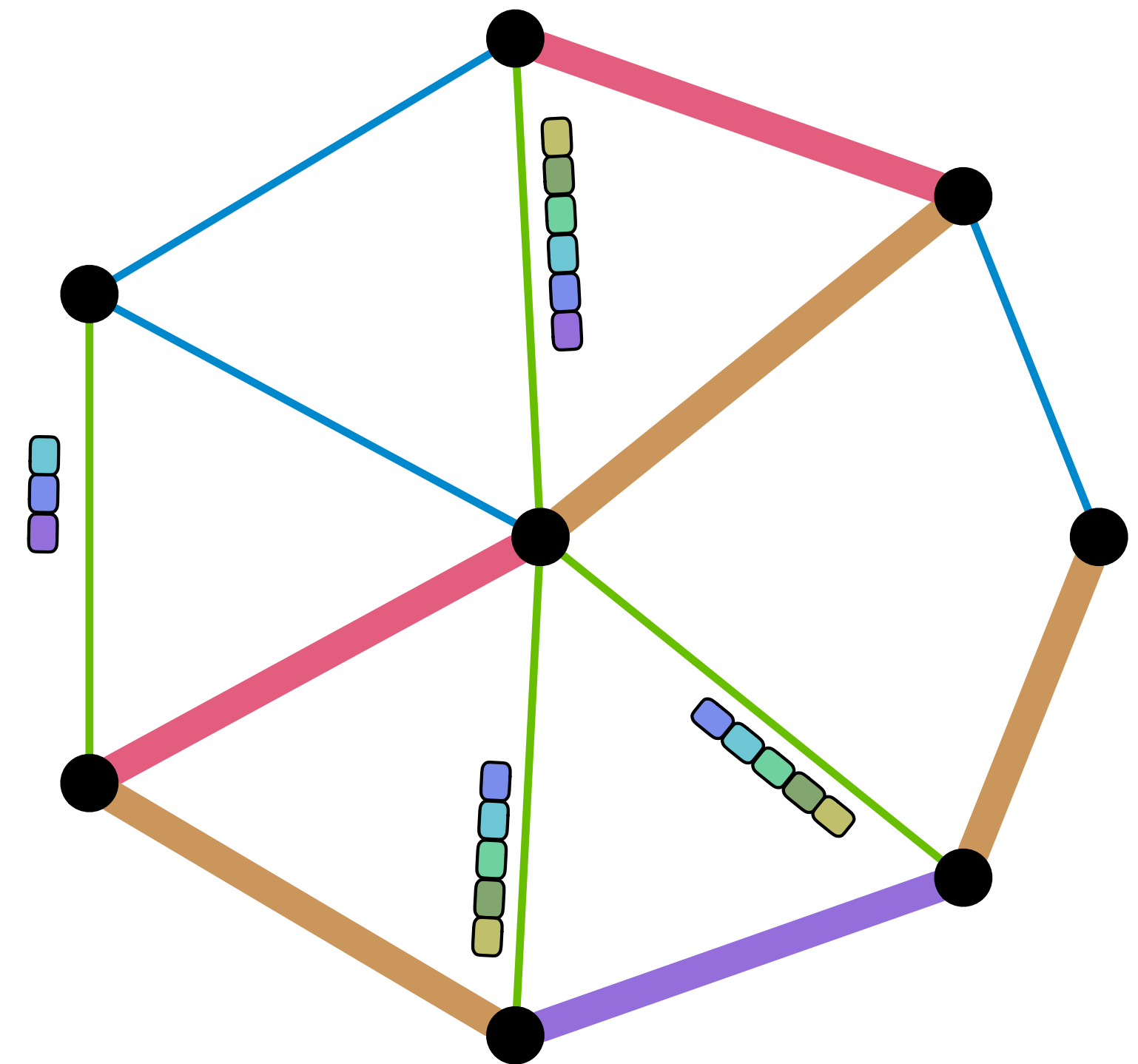
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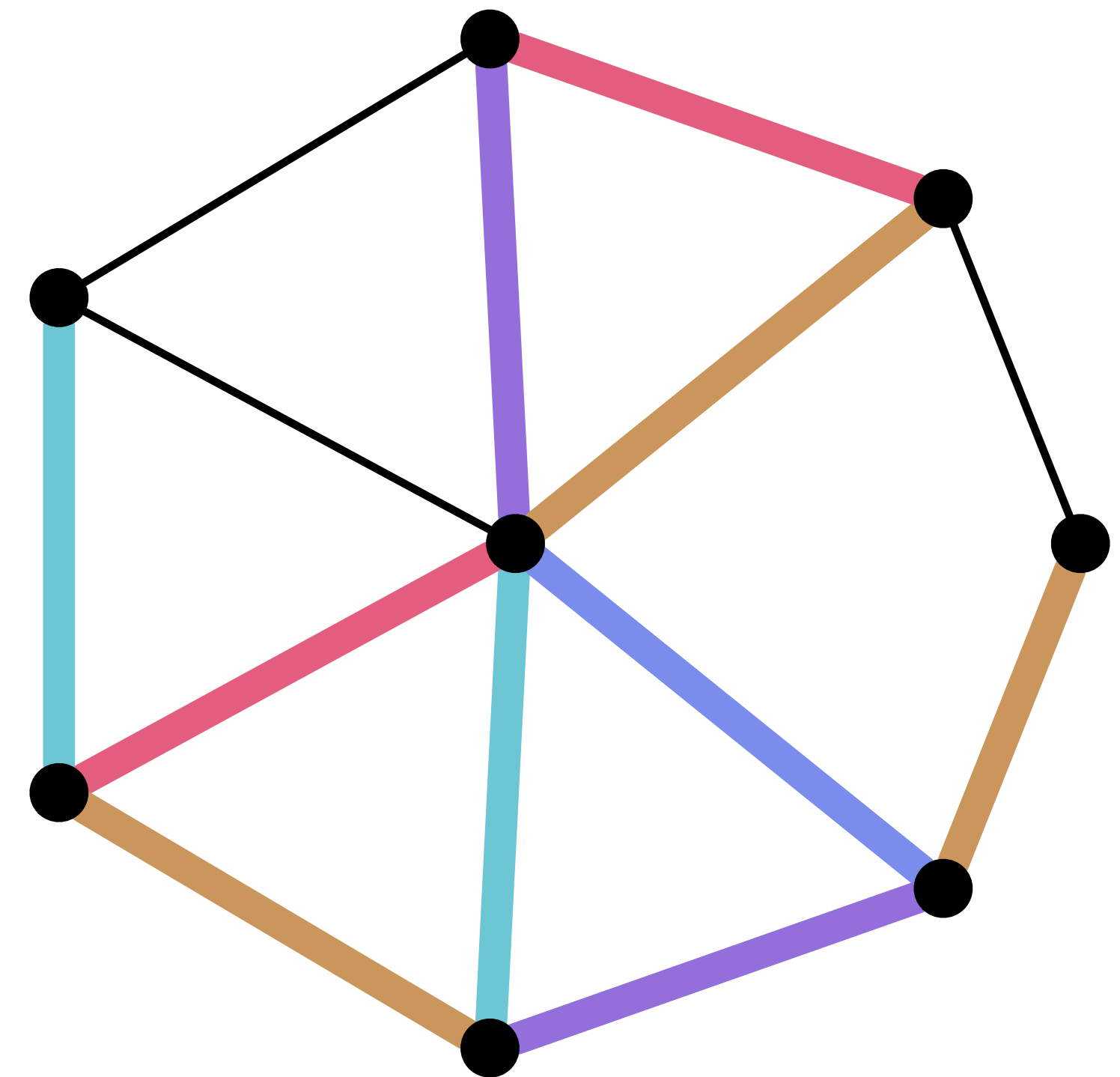
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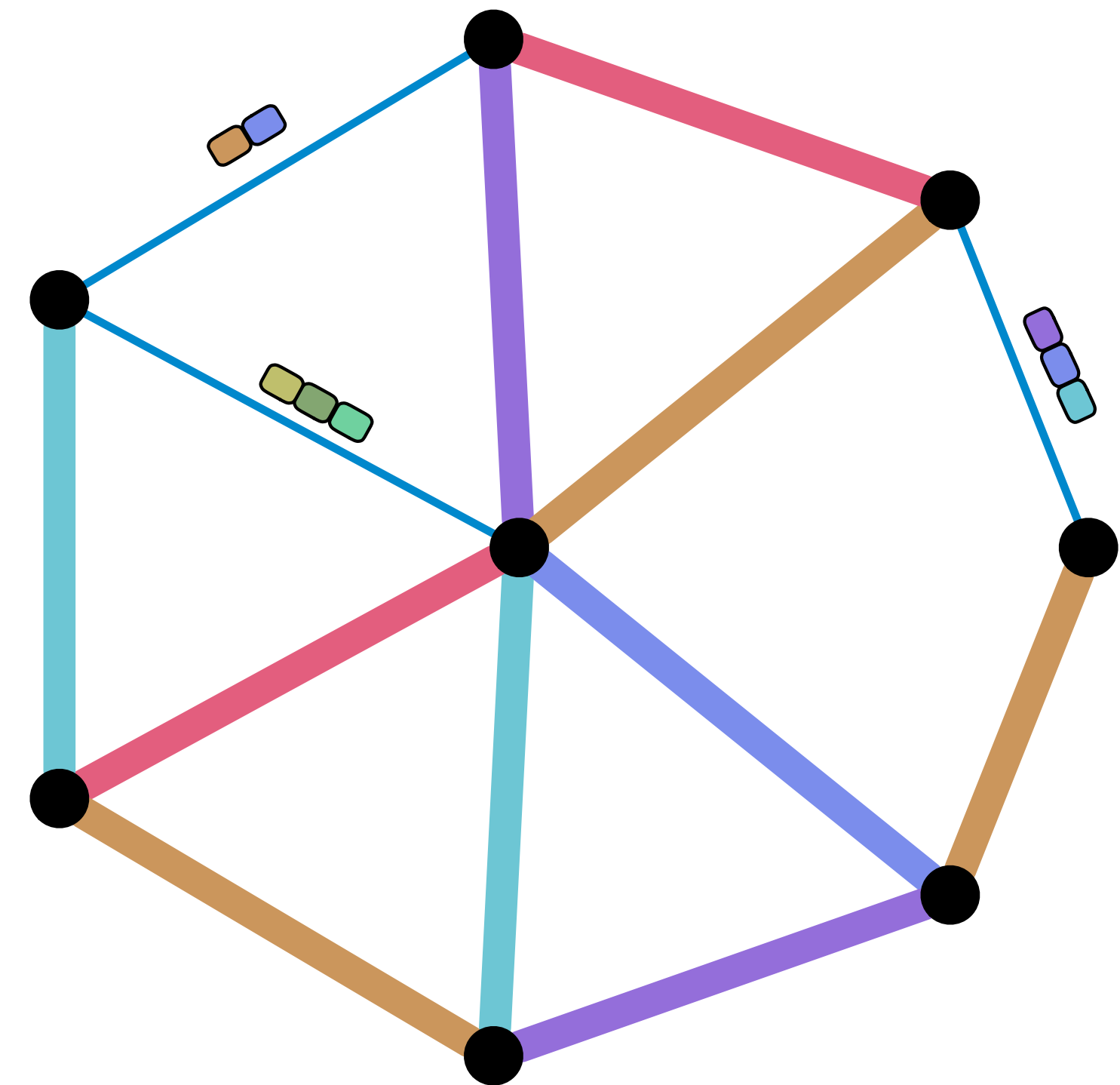
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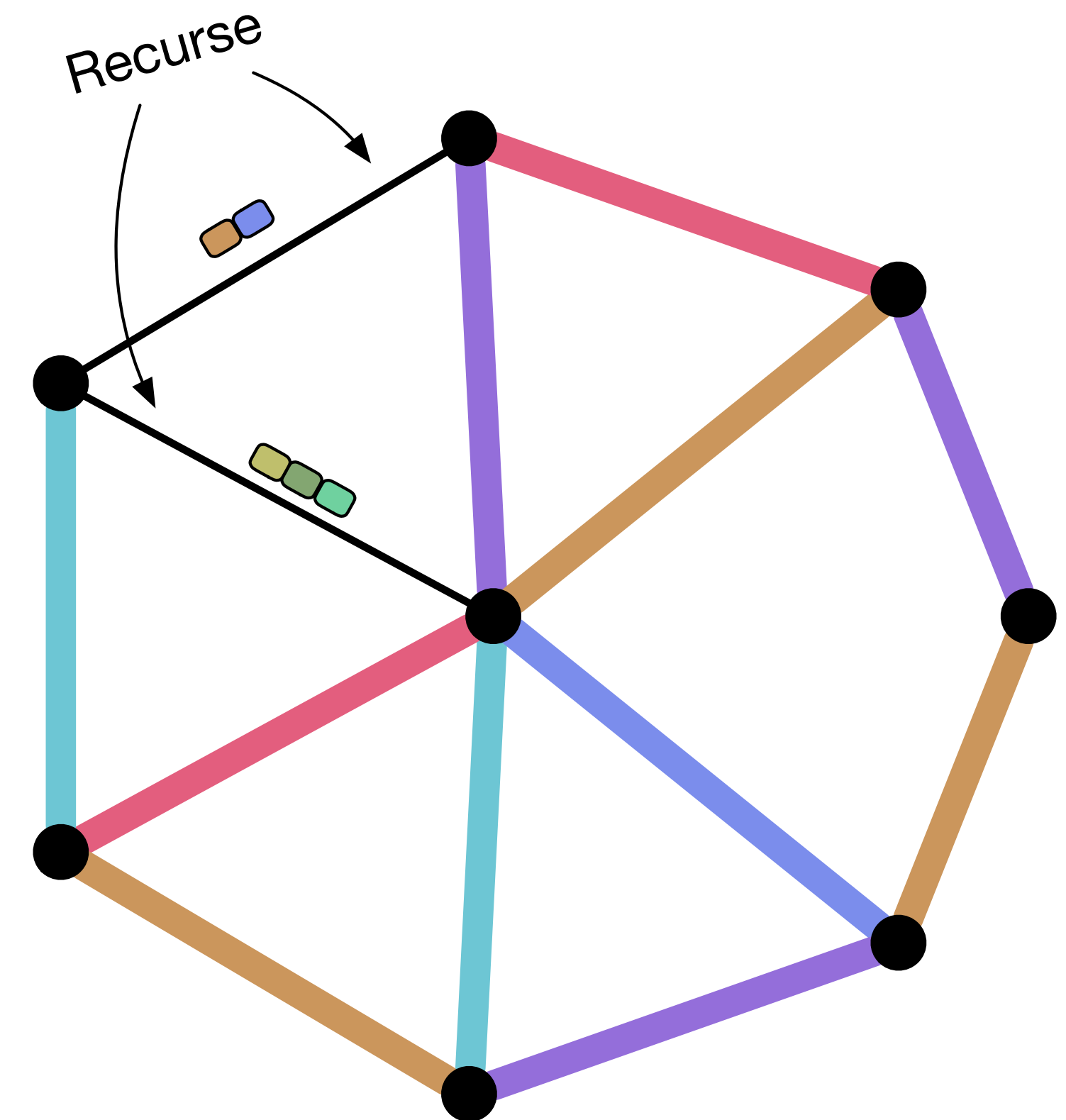
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- Solve **many instances of relaxed** list edge coloring **sequentially** (by going through color classes)



# Increasing the slack

- Compute a  $\text{deg}(e)/(2\beta)$ -defective edge coloring  $g(e)$  with  $O(\beta^2)$  colors
- Iterate through each color class  $i$ . Edges of color  $i$  do the following:
  - Remove from the list the colors  $c(e')$  already used by the neighbors
  - If the list has size larger than  $\text{deg}(e)/2$  stay **active**
  - Apply the algorithm for slack  $\beta$  on active edges, obtain  $c(e)$
- **Recurse** on uncolored edges

# Increasing the slack

$$T(1, \mathbf{C}) \leq T(\text{defective-coloring}) + \text{nr\_color\_classes} \cdot T(\text{large slack}) + T(\text{recursion})$$

$$T(1, \mathbf{C}) \leq \beta^2 \cdot \log \Delta \cdot T(\beta, \mathbf{C})$$

# High level idea

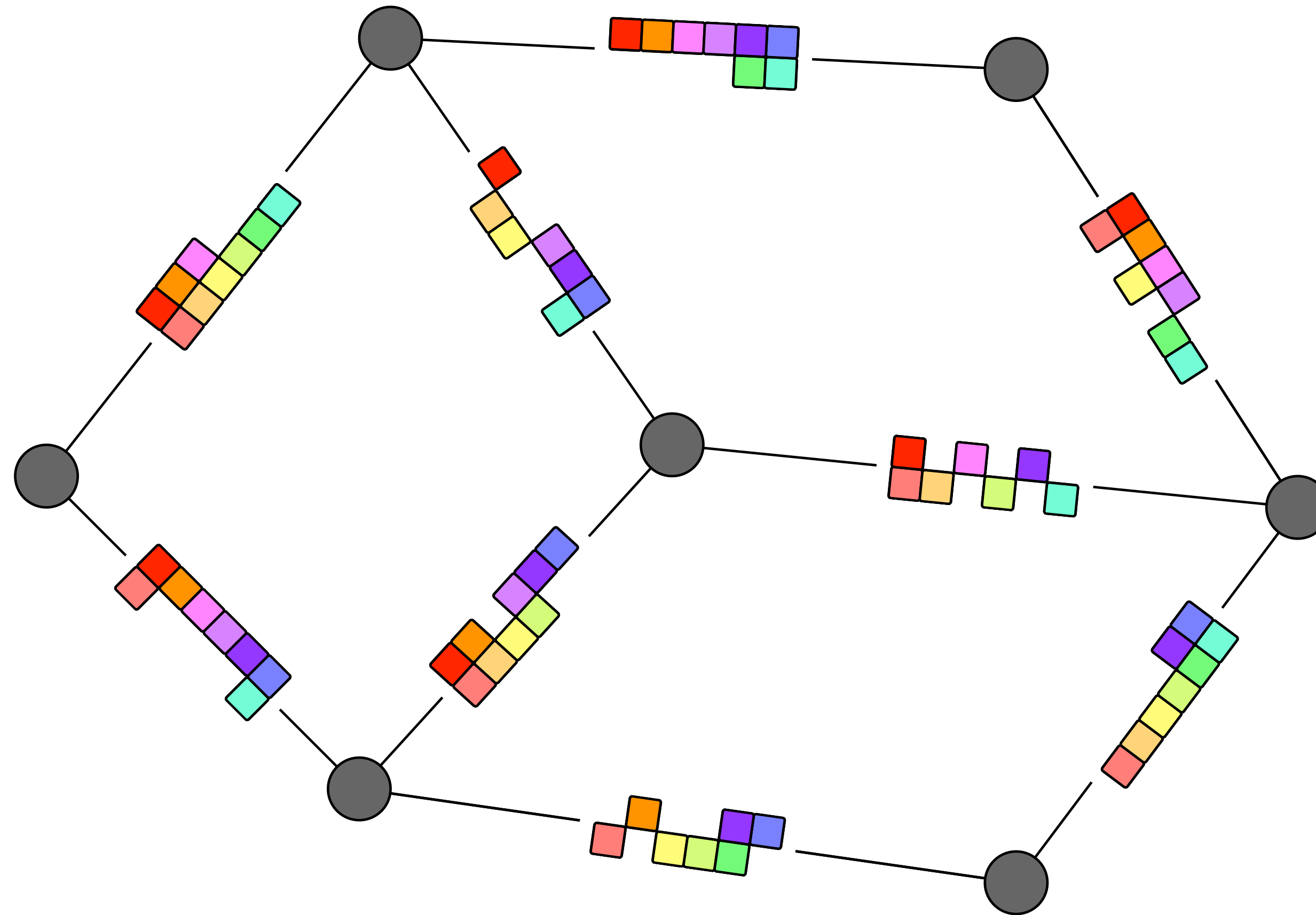
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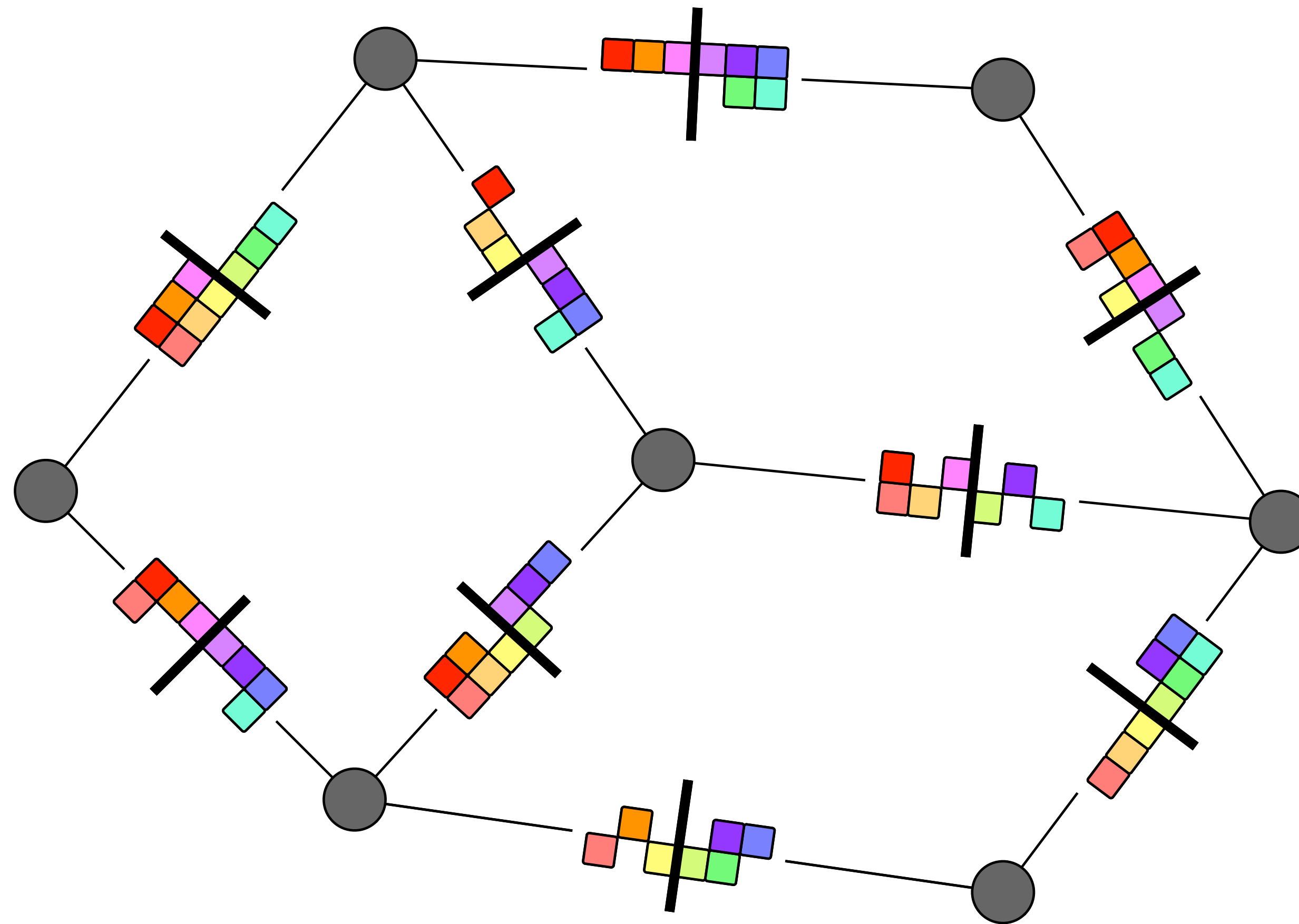
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# Relaxed list edge coloring

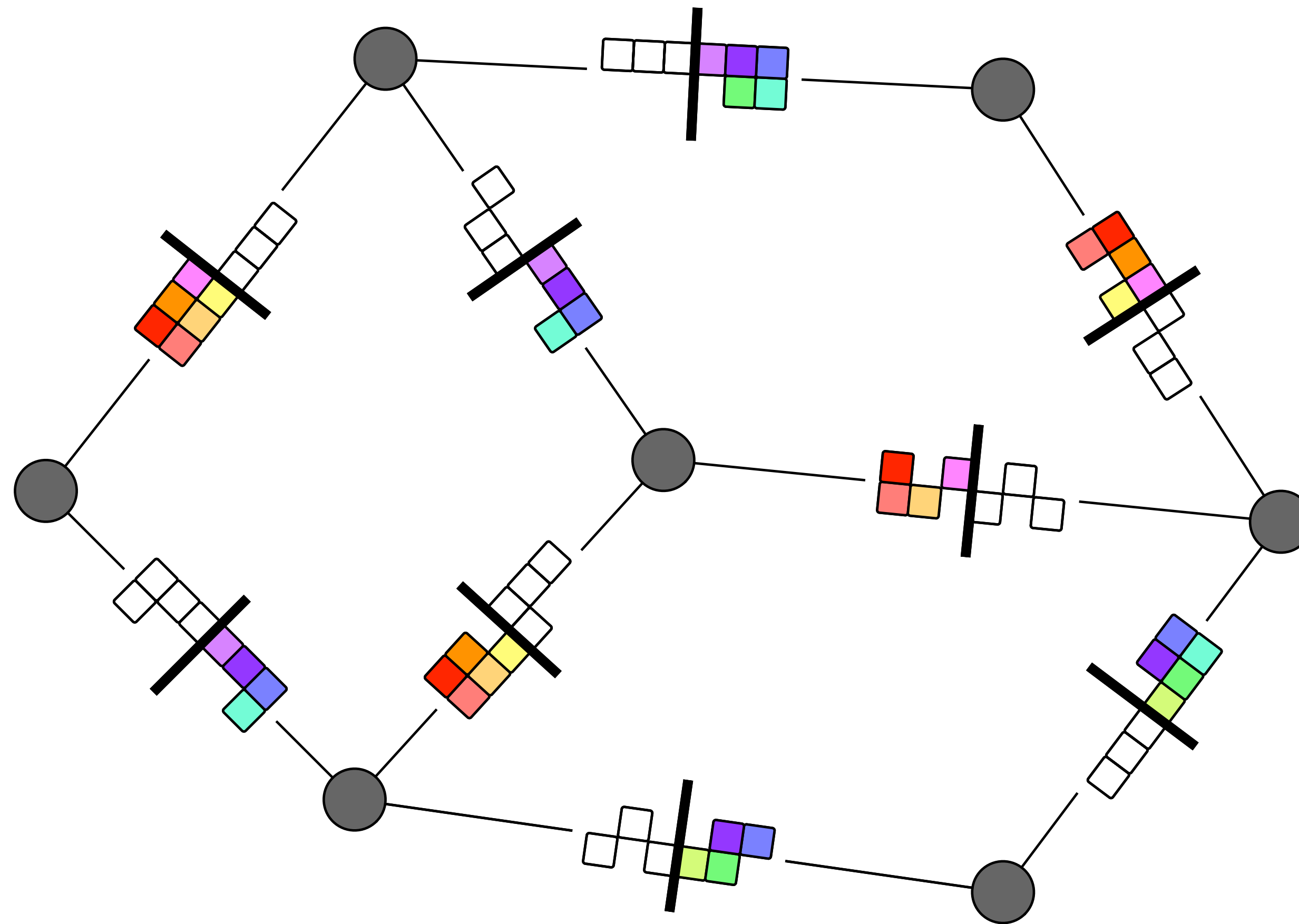


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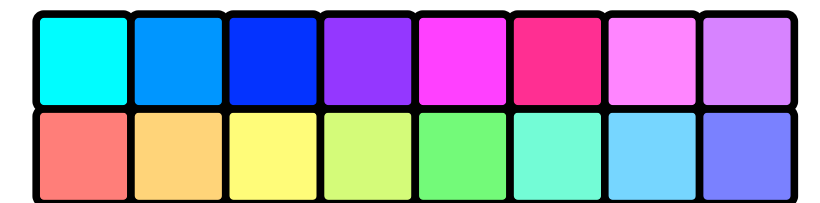
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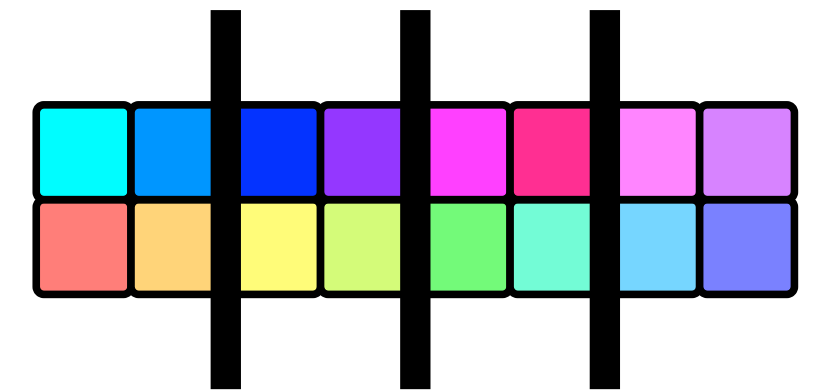
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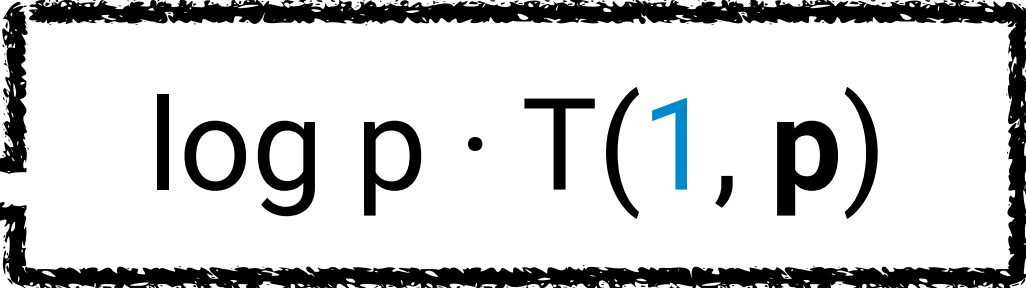
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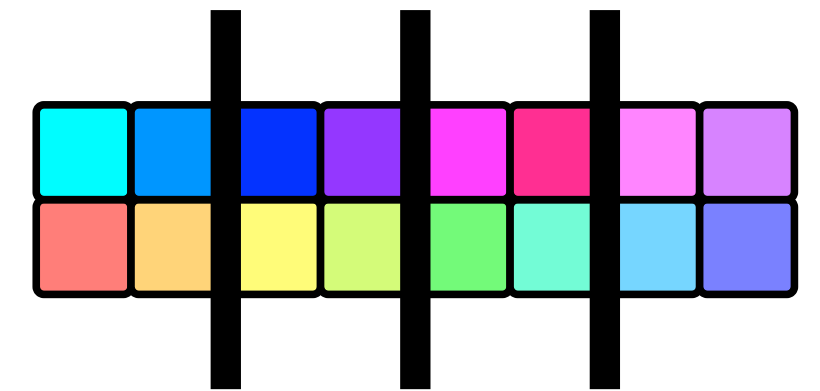




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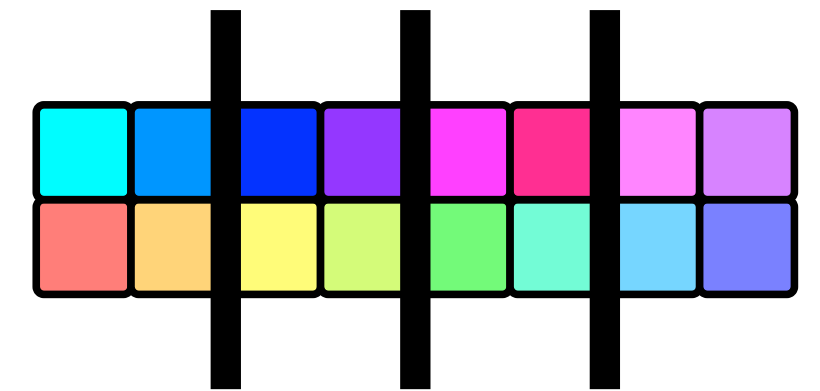
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- Split the color space into many independent subspaces
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- Independently recurse on each graph induced by edges with the same assigned subspace  $T(\beta/\text{polylog } p, \mathbf{C}/p)$



# Relaxed list edge coloring

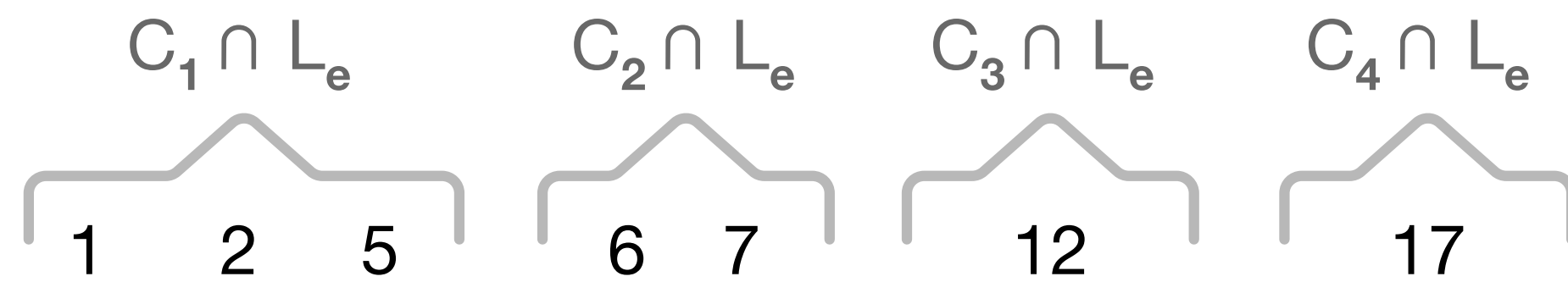
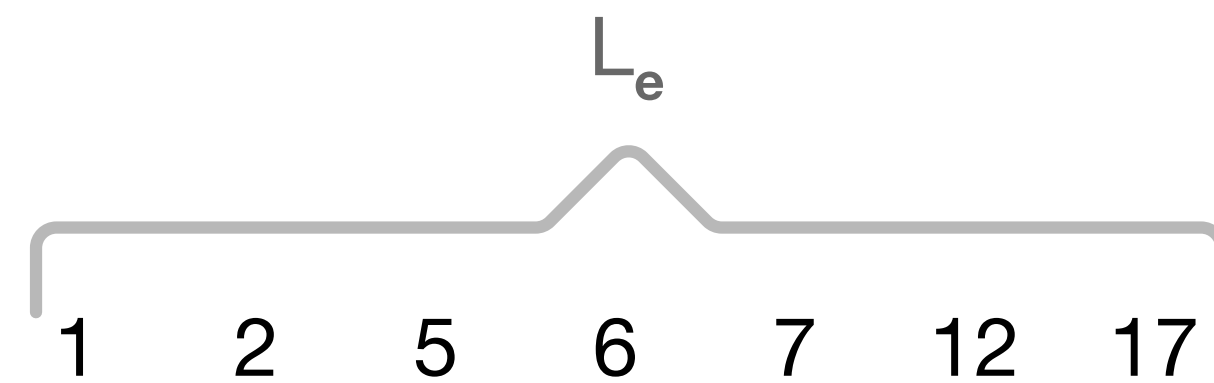
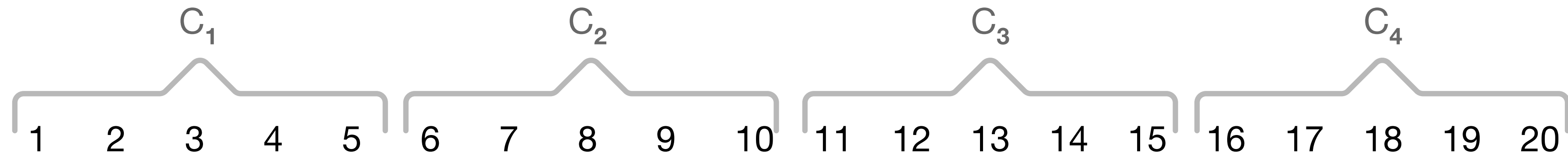
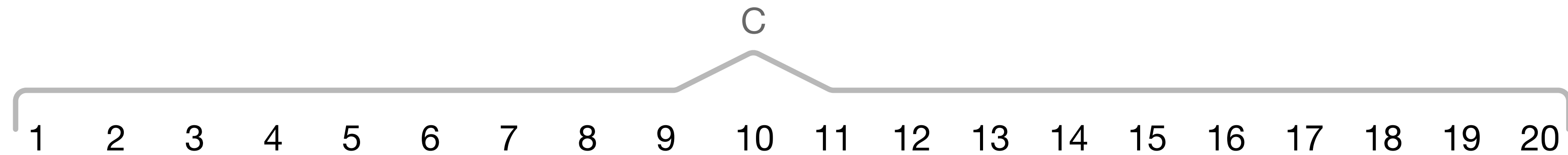
$$T(\beta, \mathbf{C}) \leq \log p \cdot T(1, p) + T(\beta/\text{polylog } p, \mathbf{C}/p)$$

- Split the color space into many independent subspaces
- Assign a subspace to each edge
- Independently recurse on each graph induced by edges with the same assigned subspace

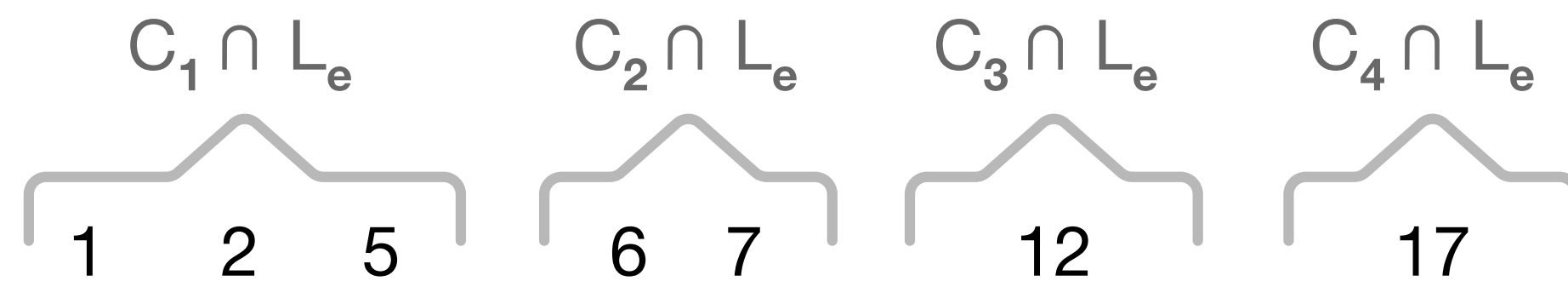
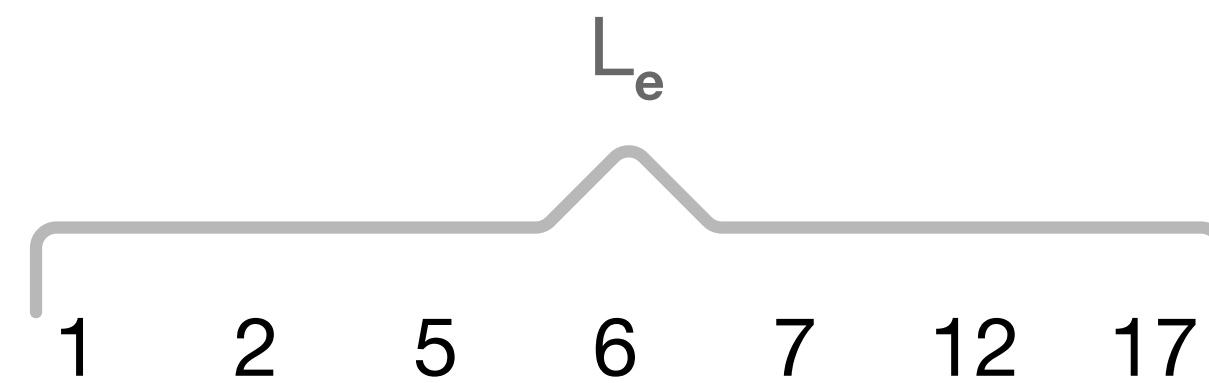
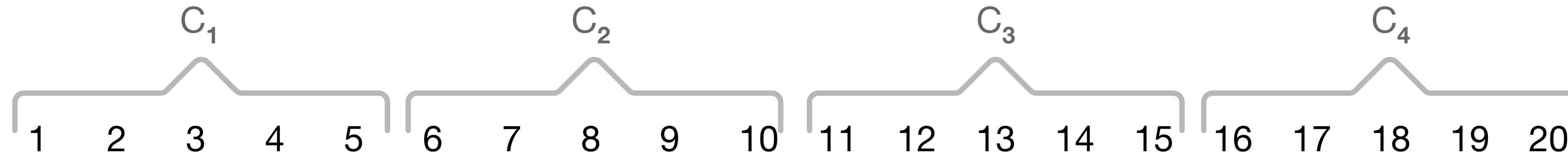
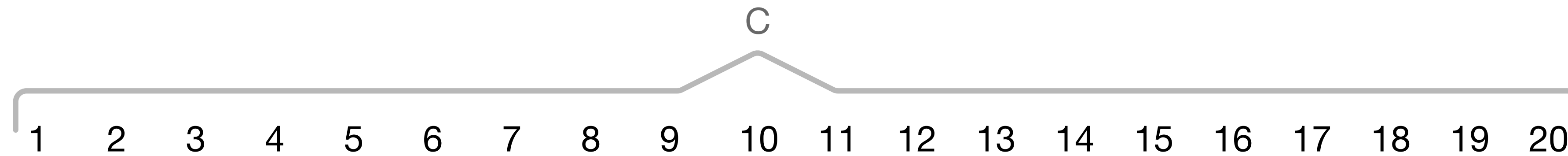

$$\log p \cdot T(1, p)$$


$$T(\beta/\text{polylog } p, \mathbf{C}/p)$$

# Subspace assignment

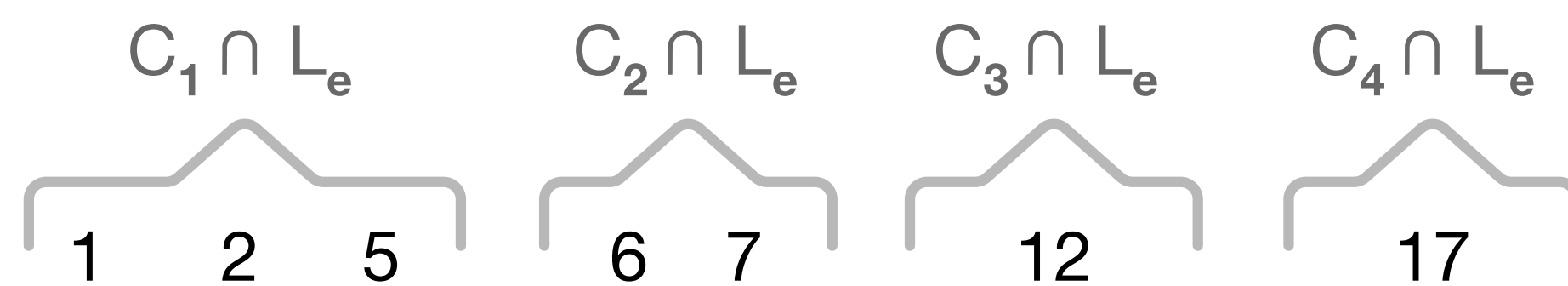
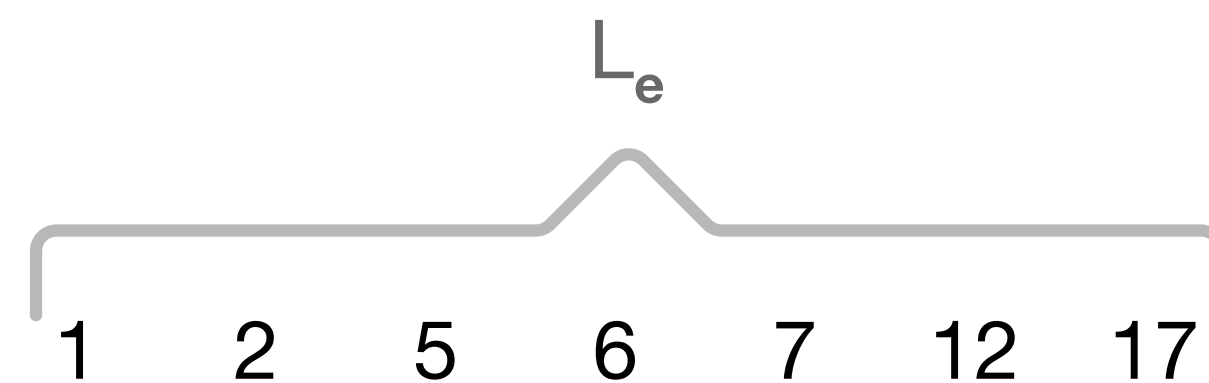
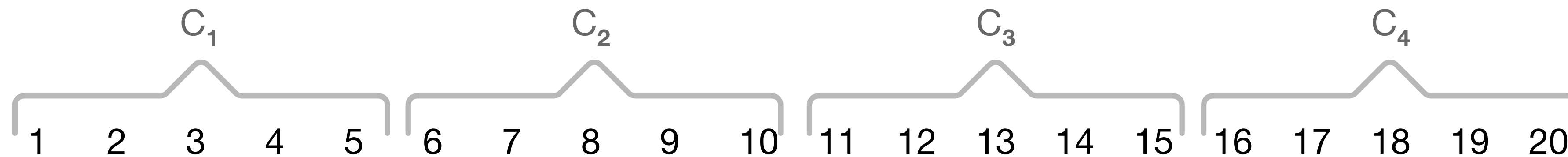
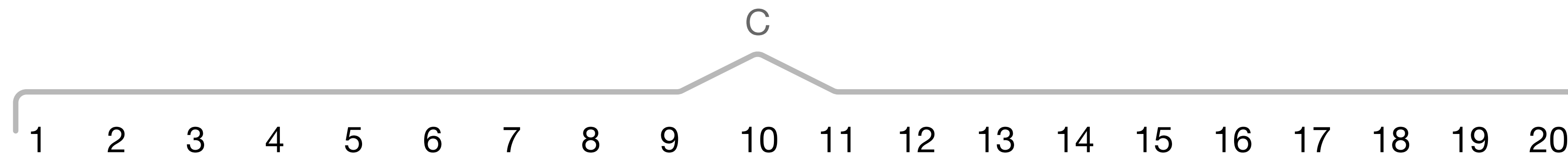


# Subspace assignment



**"There are many subspaces that are large enough"**

# Subspace assignment



$\exists k$  s.t. there are at least  $k$  lists  $C_i$  satisfying  $|C_i \cap L_e| \geq |L_e| / (k H_p)$

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**Simple case:**

- $k$  is the **same** for all edges

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**Simple case:**

- $k$  is the **same** for all edges

**Goal:**

- assign a list to each edge such that "few" neighboring edges have the same list

# Subspace assignment

# Subspace assignment

**How:**

# Subspace assignment

## How:

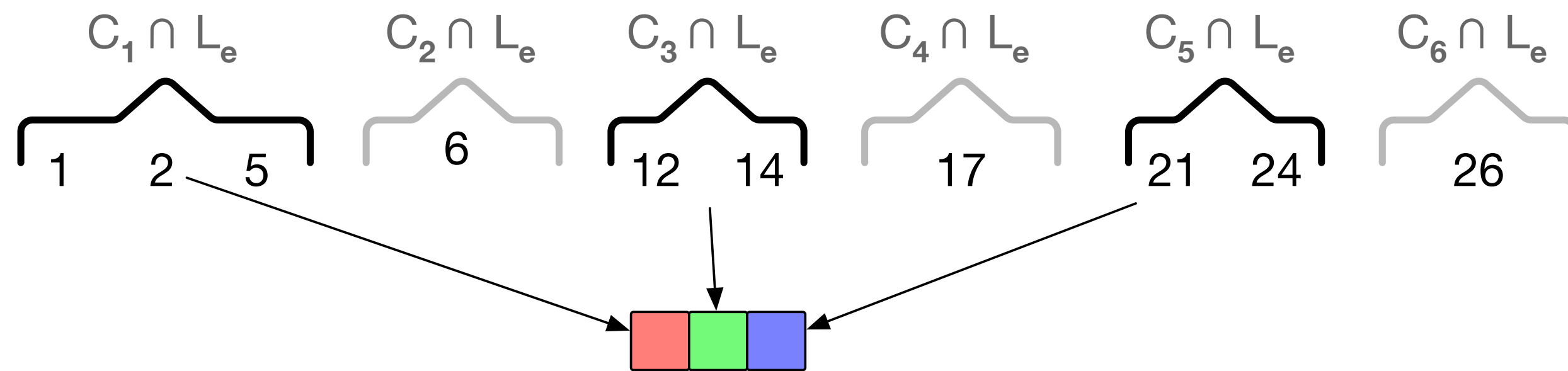
- Transform this problem into a list coloring instance



# Subspace assignment

## How:

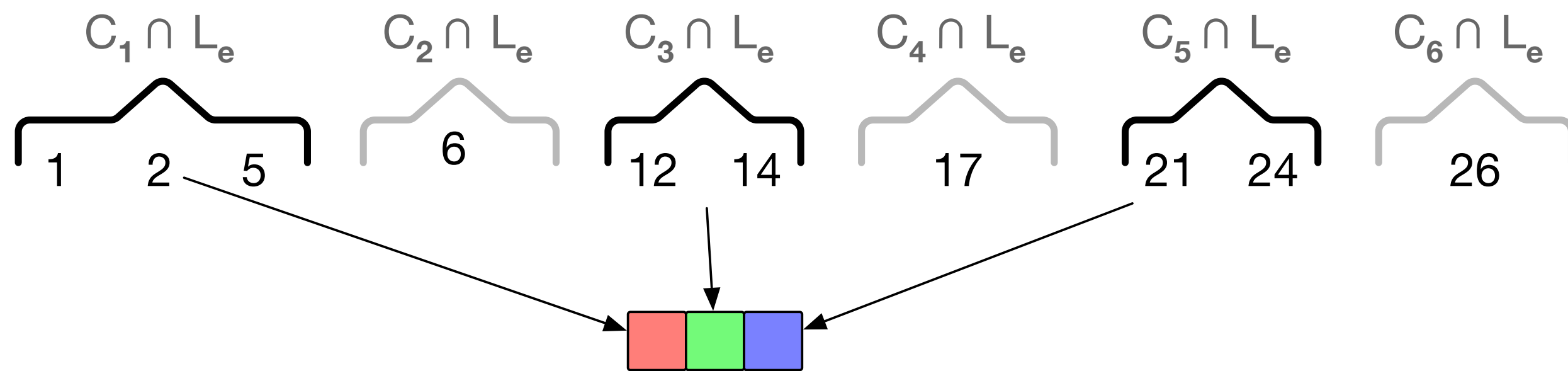
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# Subspace assignment

## How:

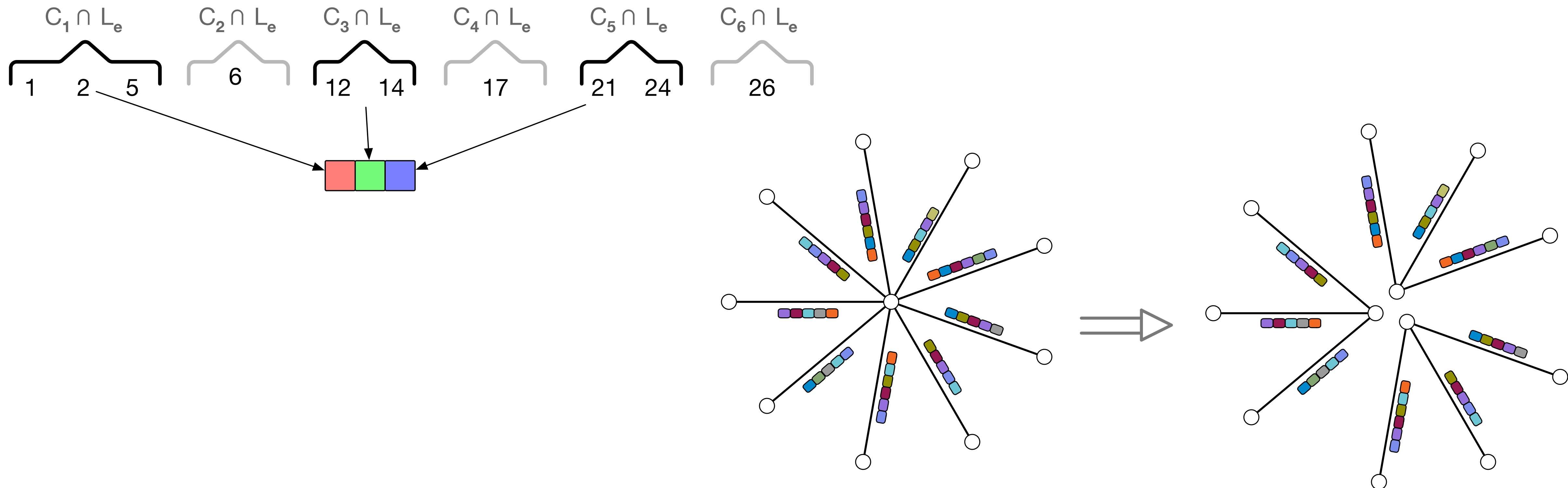
- Transform this problem into a list coloring instance
- Modify the graph such that the edge degree is at most **k-1**



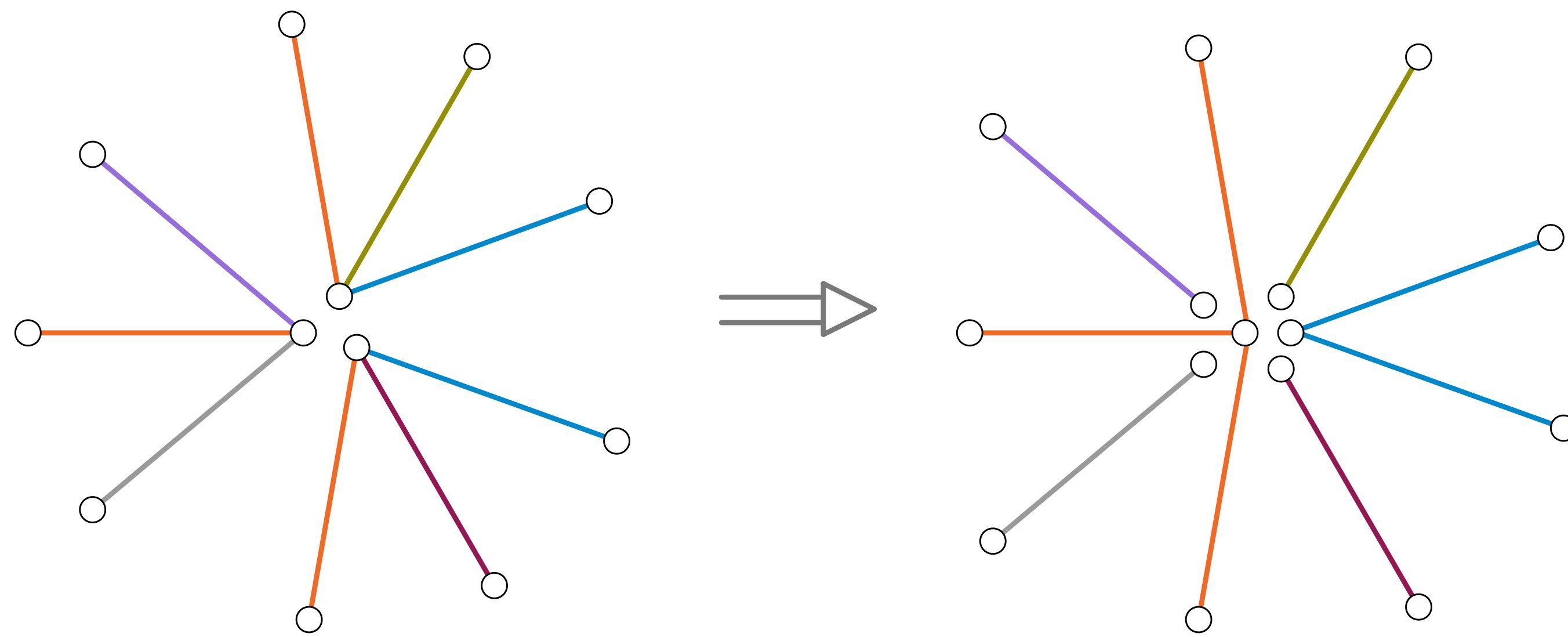
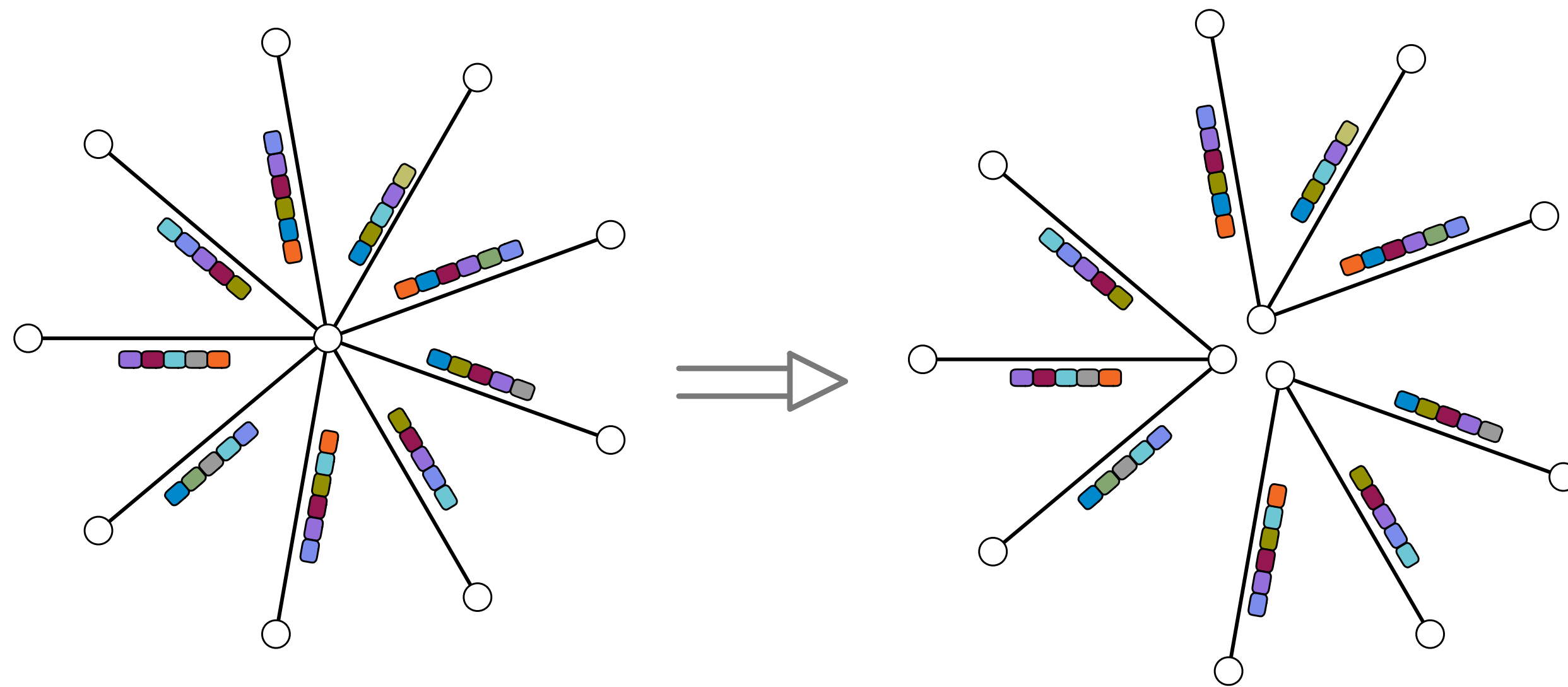
# Subspace assignment

## How:

- Transform this problem into a list coloring instance
- Modify the graph such that the edge degree is at most **k-1**



# Subspace assignment



# Subspace assignment

$\exists k$  s.t. there are at least  $k$  lists  $C_i$  satisfying  $|C_i \cap L_e| \geq |L_e| / (k H_p)$

Different edges may have different  $k$ . Solution:

- Split edges in **buckets** with "similar" values of  $k$
- Solve each bucket **sequentially** as in the simple case

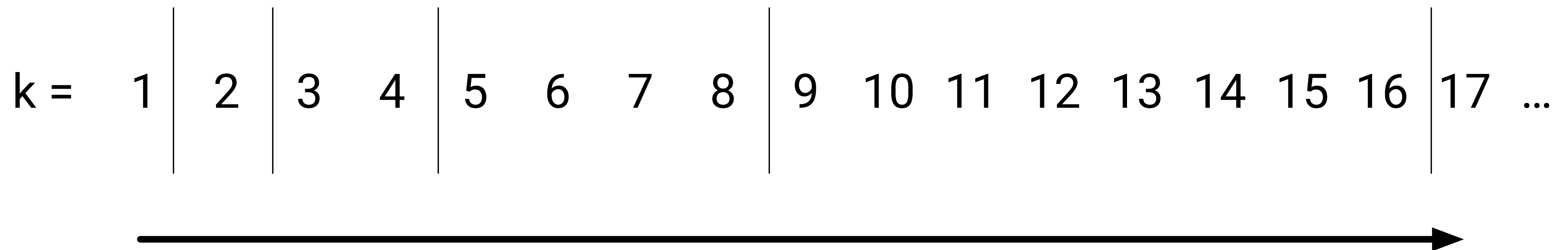
$k =$  1 | 2 | 3 4 | 5 6 7 8 | 9 10 11 12 13 14 15 16 | 17 ...

# Subspace assignment

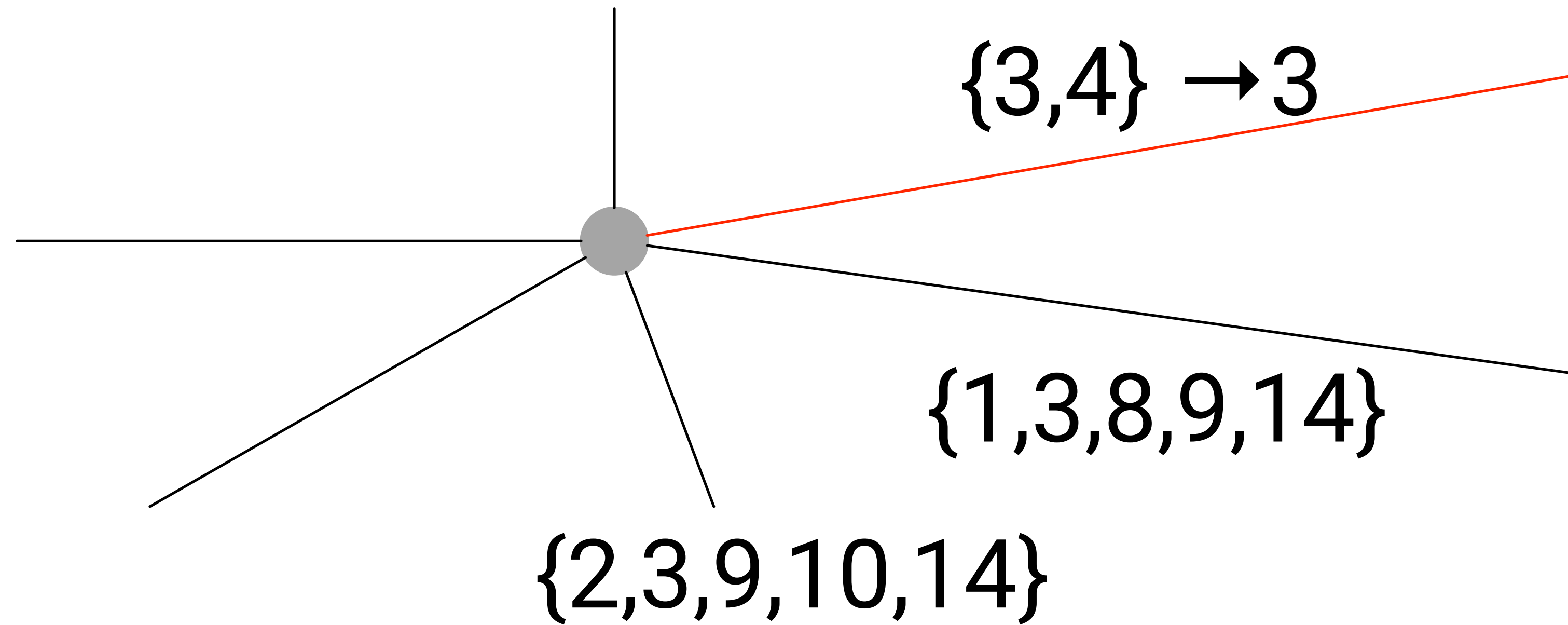
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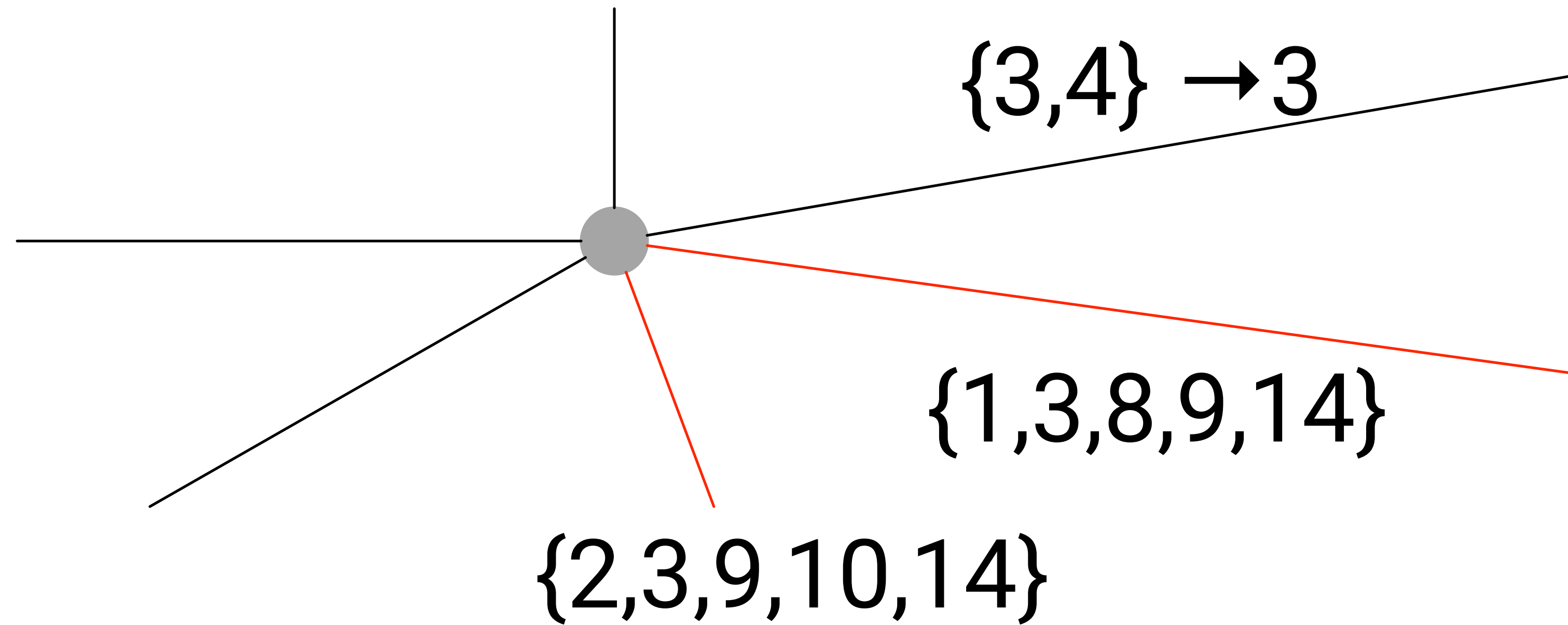
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# Subspace assignment



# Subspace assignment





# Subspace assignment

Solution:

- Make some edges inactive, based on their current defect
- More recursion!

# Relaxed list edge coloring

$$T(\beta, \mathbf{C}) \leq \log p \cdot T(1, \mathbf{p}) + T(\beta/\text{polylog } p, \mathbf{C}/p)$$

- Split the color space into many independent subspaces
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$$\log p \cdot T(1, \mathbf{p})$$


$$T(\beta/\text{polylog } p, \mathbf{C}/p)$$

# Putting things together

- Express  $(\text{degree}(e) + 1)$ -list edge coloring **as a function of** relaxed list edge coloring
  - ▶ Create many instances with smaller degree
  - ▶ Handle instances sequentially
  - ▶ Recurse
- Express relaxed list edge coloring **as a function of** smaller list edge colouring instances
  - ▶ Split the color space in many parts
  - ▶ Assign subspaces by solving many new list coloring instances
  - ▶ Recurse

# Open questions: CONGEST model

- Can we adapt this algorithm to work in the CONGEST model?
  - ▶ If we assign colors to some edges, we have to remove those colors from the lists of their neighboring edges
  - ▶ Nodes incident on the same edge need to agree on the new list
  - ▶ Valid colors are the intersection of colors that are good for each side

# Open questions: upper bounds

- We can solve  $(2\Delta - 1)$ -edge coloring in  $\text{quasi-polylog}(\Delta) + O(\log^* n)$ 
  - ▶ Can we solve it in  $\text{polylog}(\Delta) + O(\log^* n)$  rounds?
- Can we solve vertex coloring in  $\text{subpoly}(\Delta)$ ?
  - ▶ Can we solve  $O(\Delta/c)$ -defective  $c$ -coloring fast?

# Open questions: lower bounds

- Can we prove a **non-trivial lower bound** for solving  $(2\Delta - 1)$ -edge coloring?
  - ▶ Can we show that it cannot be solved in  $o(\log \Delta) + O(\log^* n)$ ?