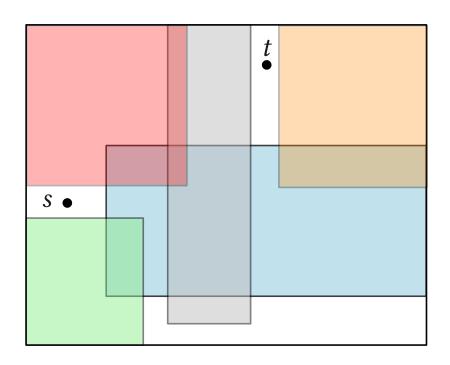


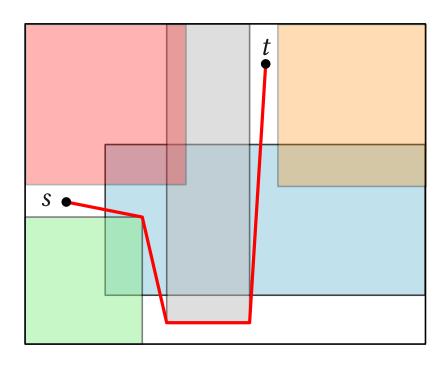
# A Constant Factor Approximation for Navigating Through Connected Obstacles in the Plane

### **Problem Definition**



**Input** : An arrangement of obstacles in plane, source s, target t

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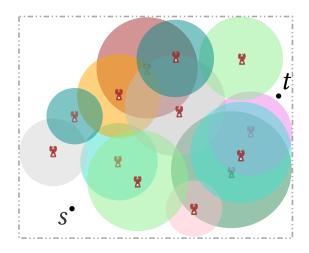
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Find an s-t path that intersects a minimum number of obstacles

## **Problem History**

- Barrier Resillience in sensor networks
  - disk obstacles

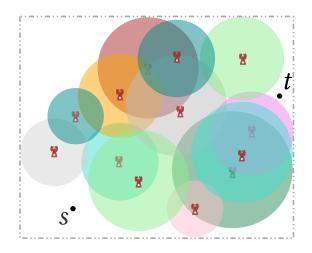
Resillience of sensor network to an adversary



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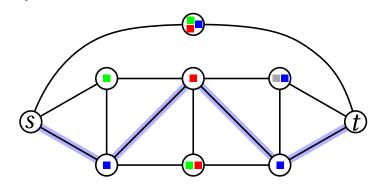
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- Minimum Constraint Removal in robotics and computational geometry
  - Polygonal Obstacles
- *Min-Color Path* in graph theory
  - Vertices assigned a subset of colors  $\{1, 2, \ldots, m\}$  as  $\sigma: V \to 2^m$
  - find an s-t path  $\pi$  with minimum colors

minimize colors in  $\sigma(\pi) = \bigcup_{v \in \pi} \sigma(v)$ 



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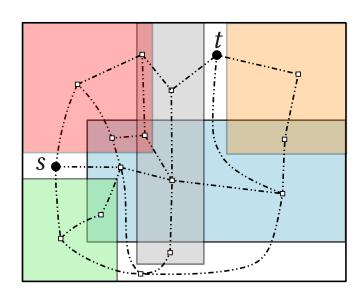
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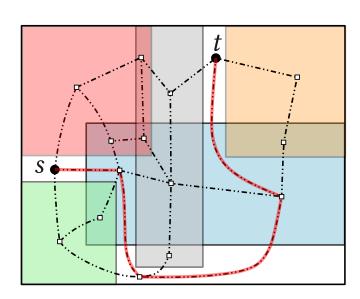


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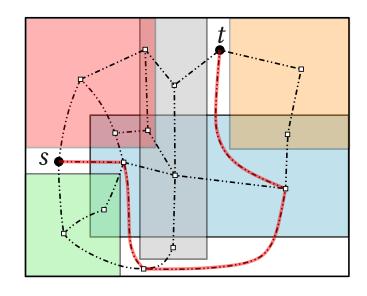


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This graph is planar and color-connected

(vertices containing any given color are connected)

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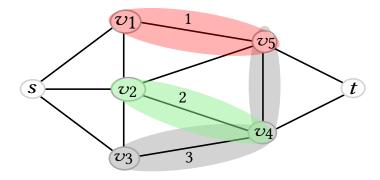
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rest of this talk

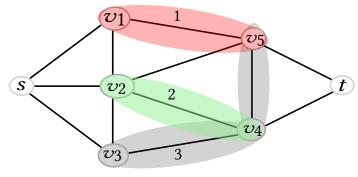
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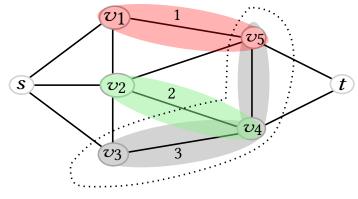


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**Color Separator**: set of colors SV(S) = vertices that contain a color in S

Removing V(S) disconnects s from t



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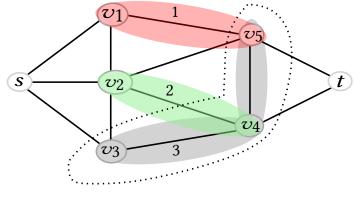
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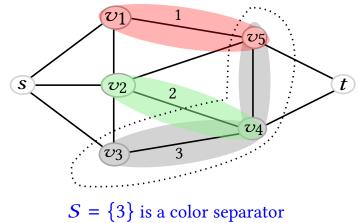
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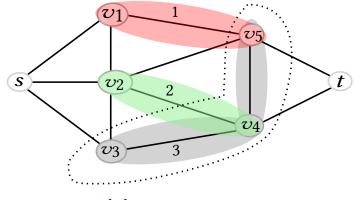
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**Min-color hitting set**: smallest set of colors that "hits" every color separator smallest  $\mathcal{C}^* \subseteq \{1, \ldots, m\}$  such that  $\mathcal{C}^* \cap S \neq \emptyset$  for every  $S \in \mathcal{F}$ 

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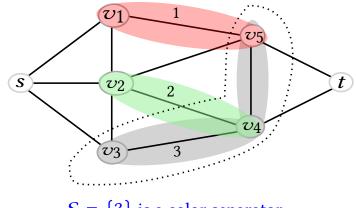
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**Lemma**: Min-Color Path ⇔ Min-Color Hitting Set

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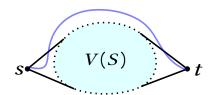
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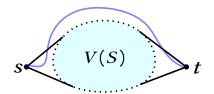
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- Remove colors in  $\mathcal{C}^*$  from G, that is,  $\sigma'(v) = \sigma(v) \setminus \mathcal{C}^*$
- $-(G, \sigma')$  contains a path  $\pi'$  with zero colors

because if not  $S' = \bigcup_{v \in V} \sigma'(v)$  will be a color separator with  $S' \cap C^* = \emptyset$ contradiction

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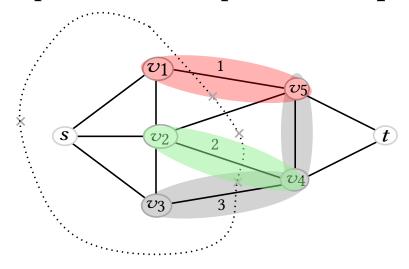
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round  $x_i$  values to obtain an integral solution  $\hat{y} = \{y_1, y_2, \dots, y_m\}$ 

**Lemma**: Exists a rounding algorithm such that  $\sum y_i = O(1) \cdot OPT$ 

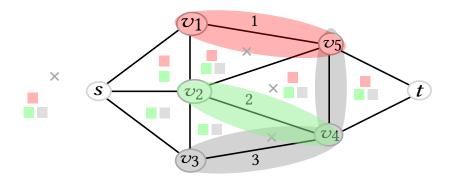
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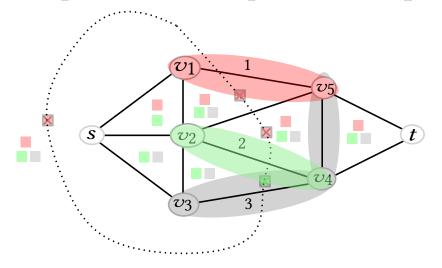


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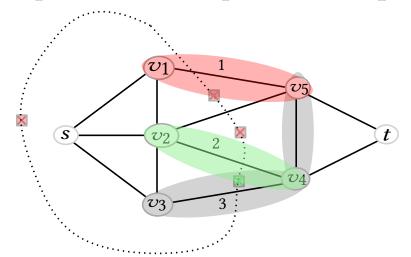
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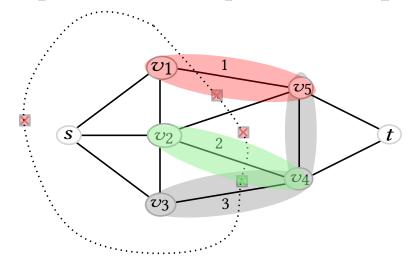
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Color Separators  $\equiv$  sequence of overlapping colors

- $oldsymbol{\circ}$  Build a *color-intersection* graph  ${\mathcal G}$ 
  - contains a vertex  $c_i$  for every color i
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