

# Ordered Median Tree Location Problem (OMT)



FPU24/01134

16th Metaheuristics International Conference

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# Outline

**1. Introduction**

**2. Proposal**

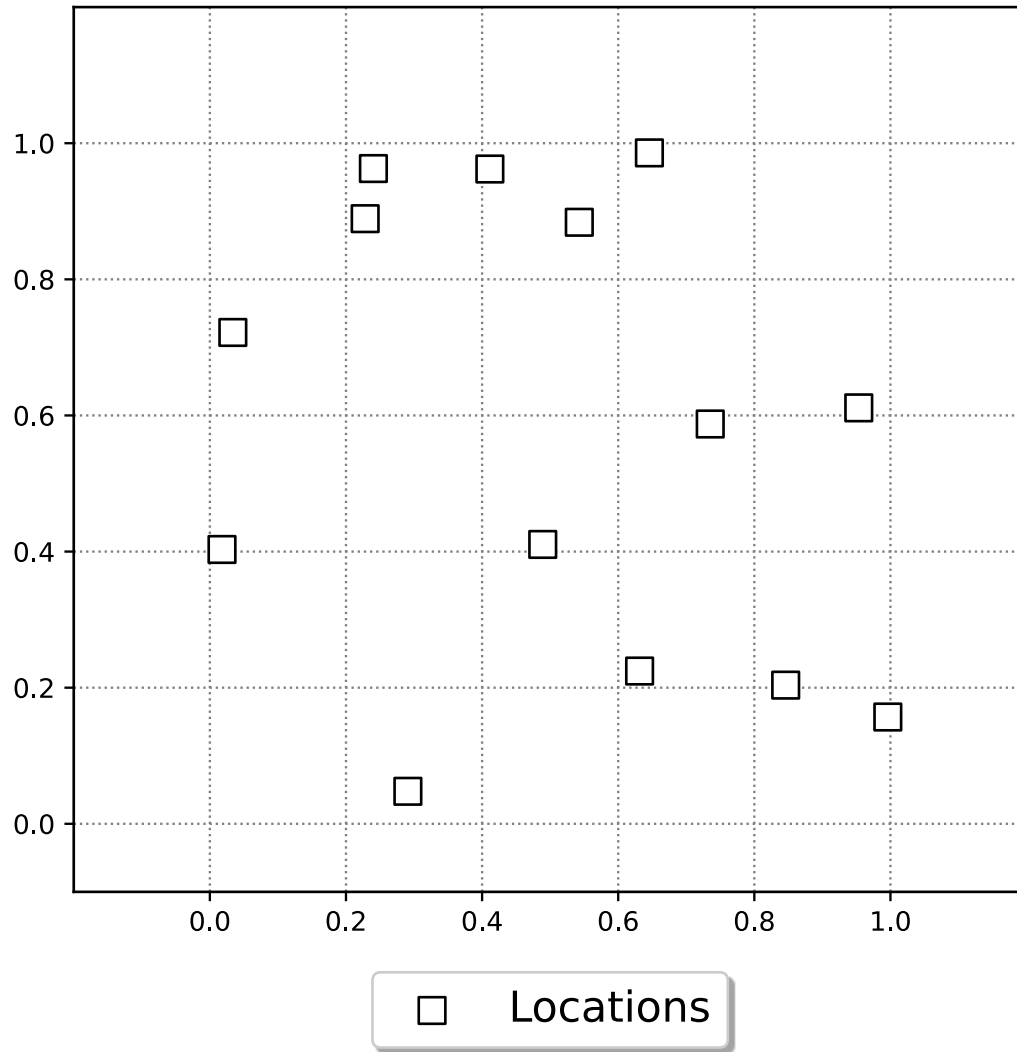
**3. Results**

**4. Conclusions and future work**

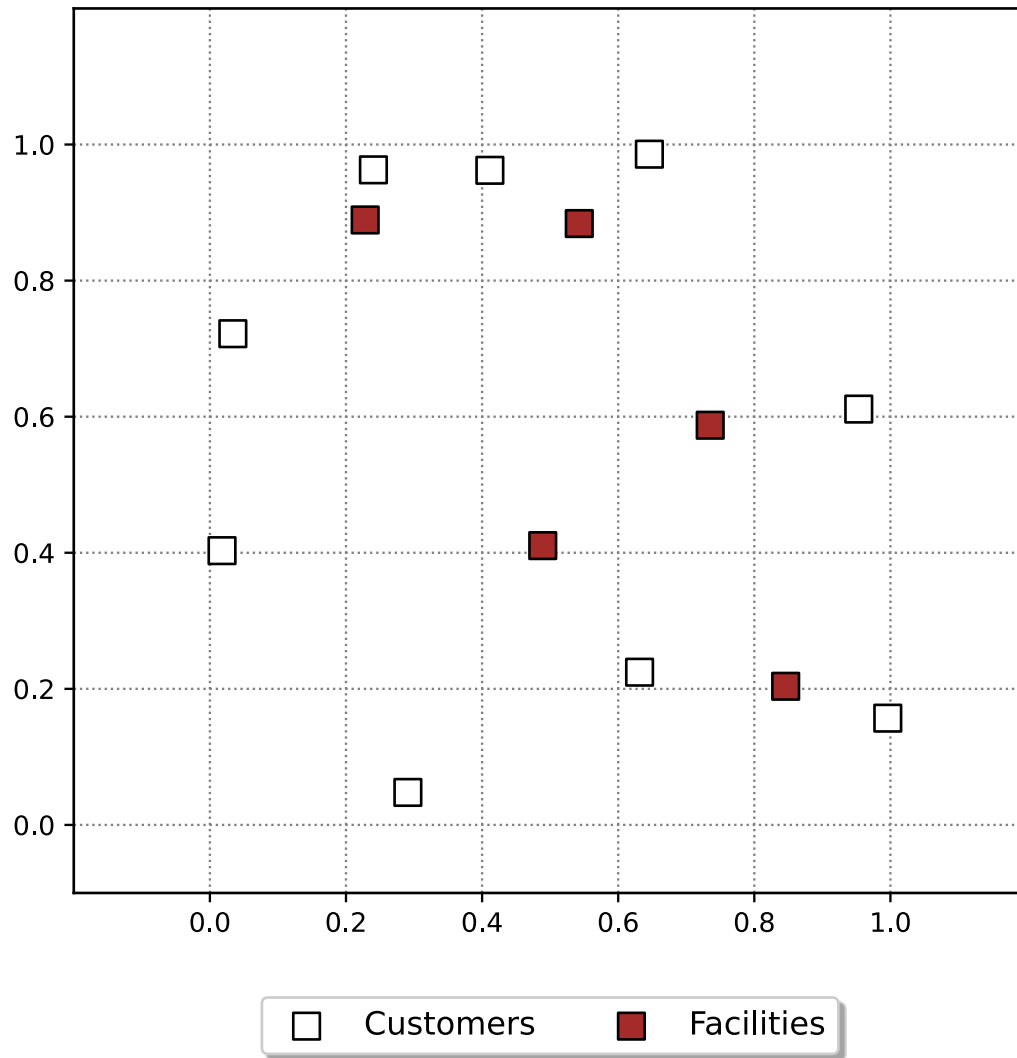
# Introduction

- The Ordered Median Tree Location Problem (**OMT**) belongs to the family of **facility location problems**.
- The objective is to **minimize** the sum of the costs of the **tree edges** connecting the facilities, plus the cost of **assigning customers** in a weighted manner.
- Applications:
  - Network configuration, telecommunications.
  - Service planning, transportation, logistics.

# Introduction

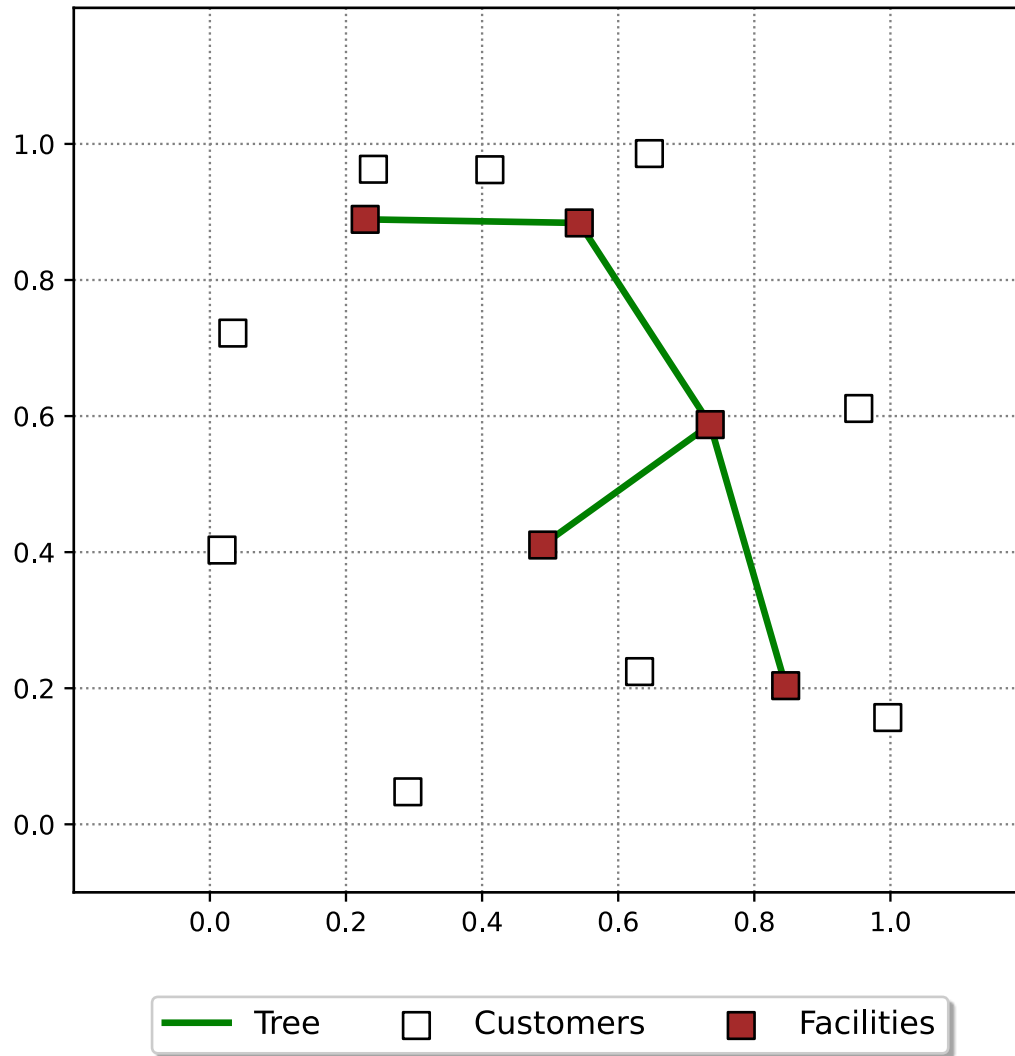


# Introduction



- **Solution:**
  - Open **p** facilities.

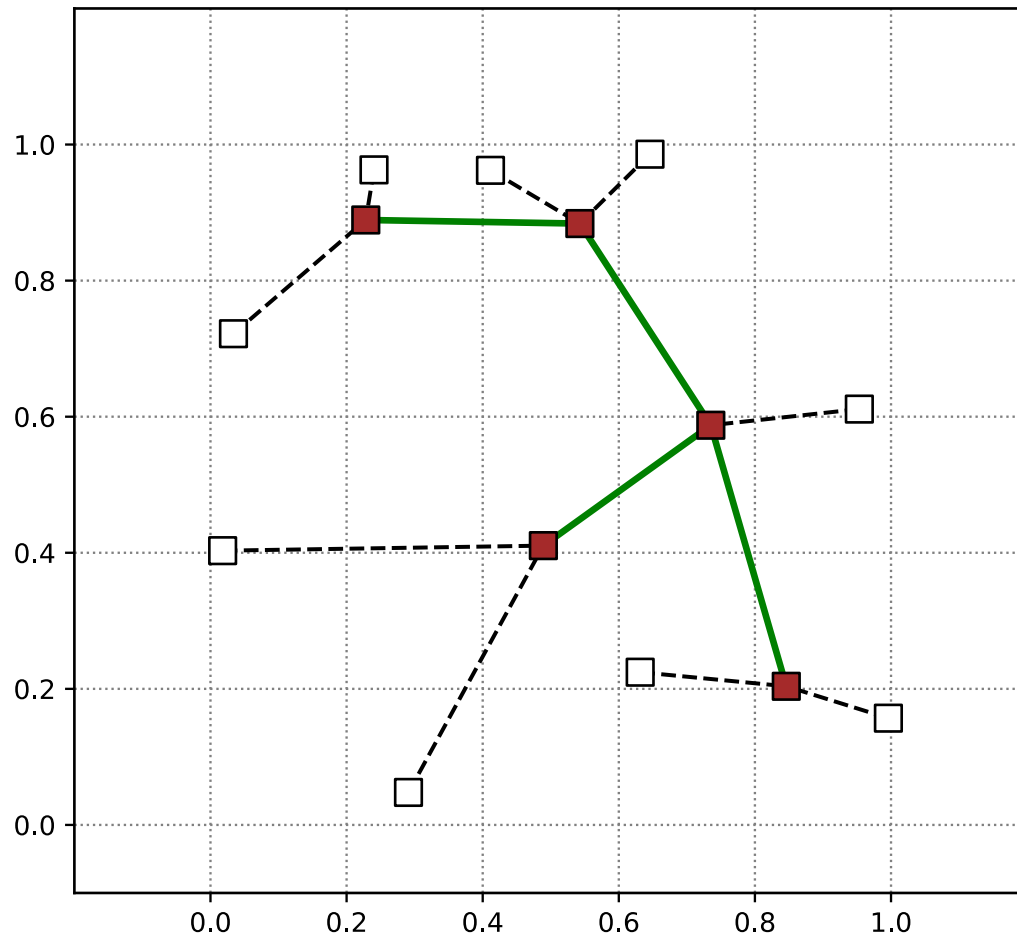
# Introduction



- **Solution:**

- Open **p** facilities.
- Connect them using an undirected **tree**.

# Introduction

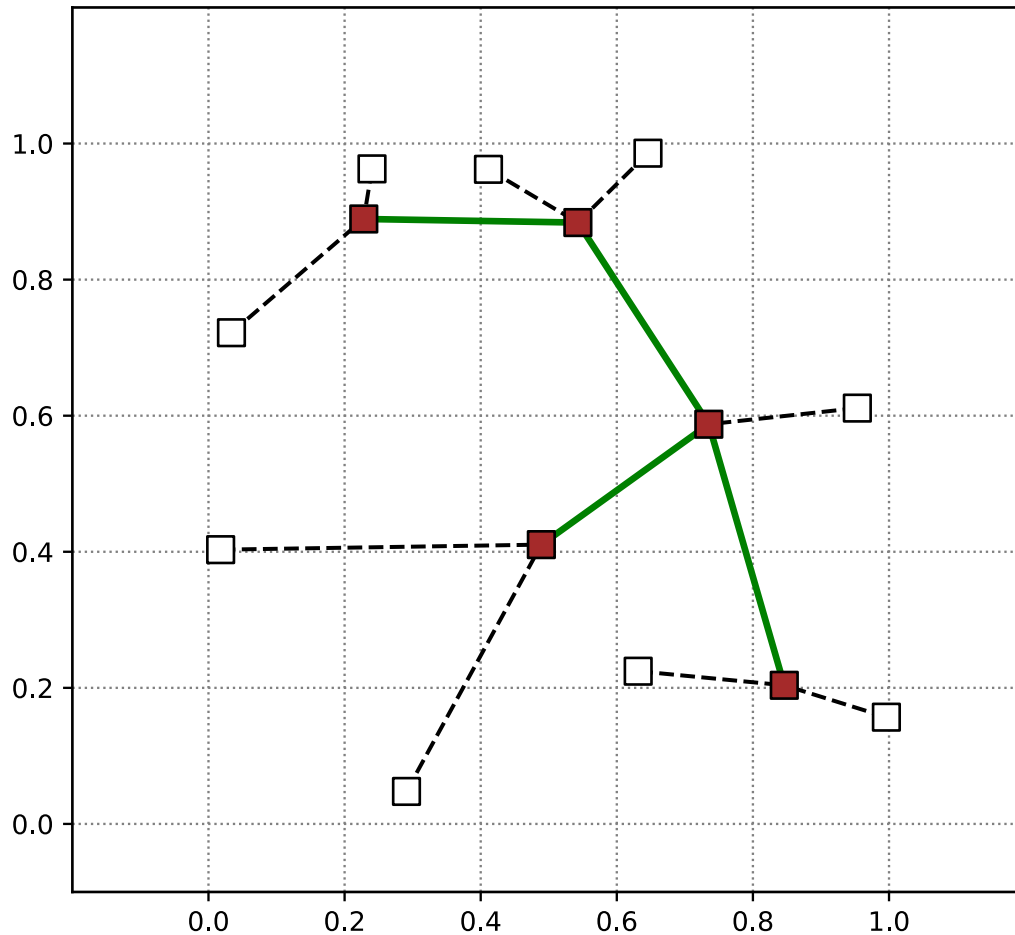


- **Solution:**

- Open **p** facilities.
- Connect them using an undirected **tree**.
- Assign each **customer** to an open facility.

— Tree    - - - assignments    □ Customers    ■ Facilities

# Introduction



## • Solution:

- Open **p** facilities.
- Connect them using an undirected **tree**.
- Assign each **customer** to an open facility.

## Objective:

- Minimize the ordered **weighted** sum of assignment costs (tree and customers).

— Tree    - - - assignments    □ Customers    ■ Facilities

# Formulation

$$\text{Minimize } \sum_{\ell \in V} \frac{1}{\lambda_\ell} \sum_{(i,j) \in A} \lambda_\ell c_{ij} x_{ij}^\ell + \frac{1}{p-1} \sum_{(i,j) \in E} c_{ij} z_{ij} \quad (1)$$

$$\text{Subject to } \sum_{i \in V} x_{ii} = p \quad (2a)$$

$$\sum_{j \in V} x_{ij} = 1 \quad i \in V \quad (2b)$$

$$x_{ij} \leq x_{jj} \quad (i, j) \in A : i \neq j \quad (2c)$$

$$2z_{ij} \leq x_{ii} + x_{jj} \quad (i, j) \in E \quad (3a)$$

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 Pozo, M.A., Puerto, J., Torrejón, A., 2024. The Ordered Median Tree Location Problem. Computers & Operations Research 169, 106746. <https://doi.org/10.1016/j.cor.2024.106746>

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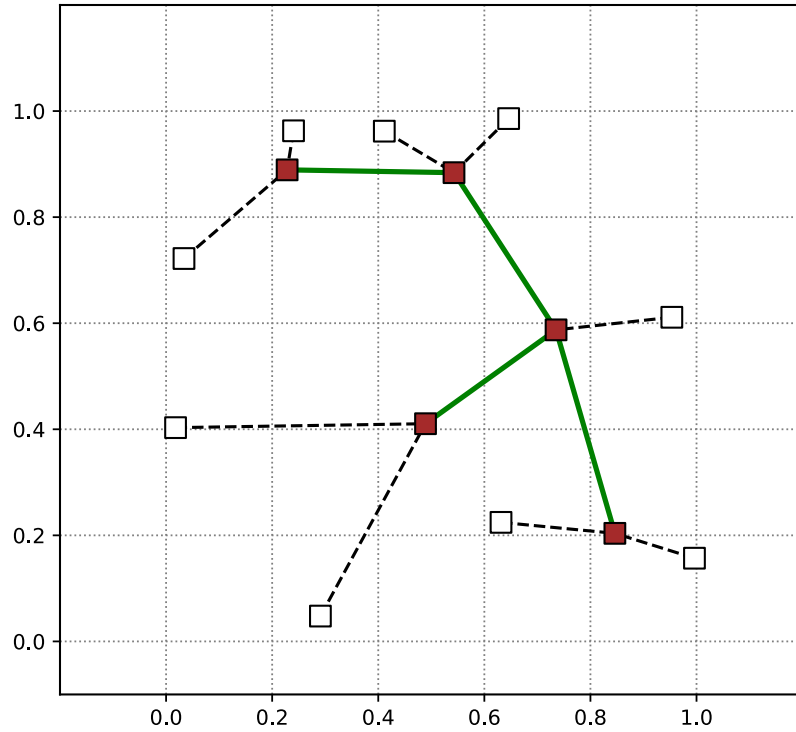
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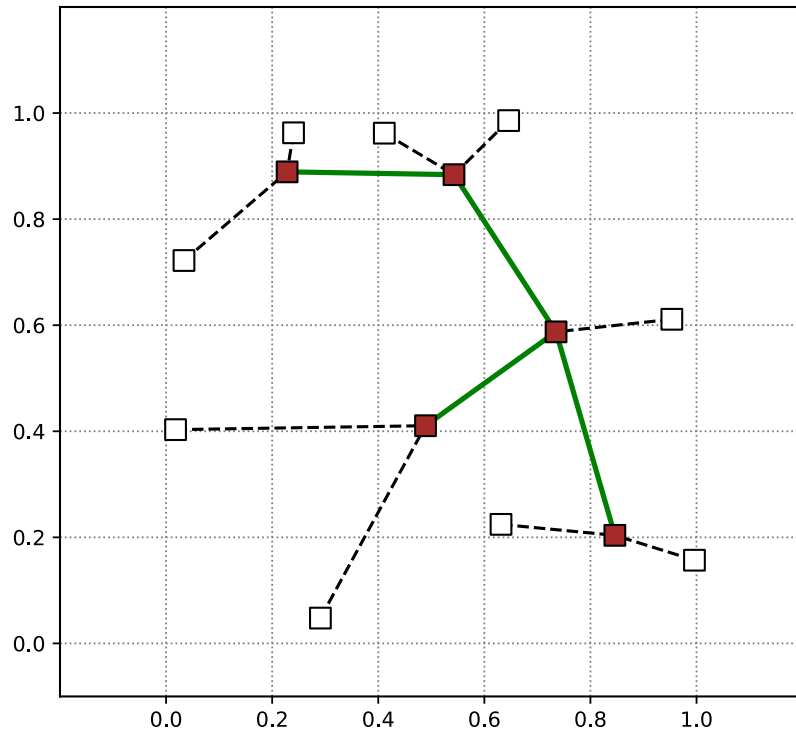
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# Cost ordering

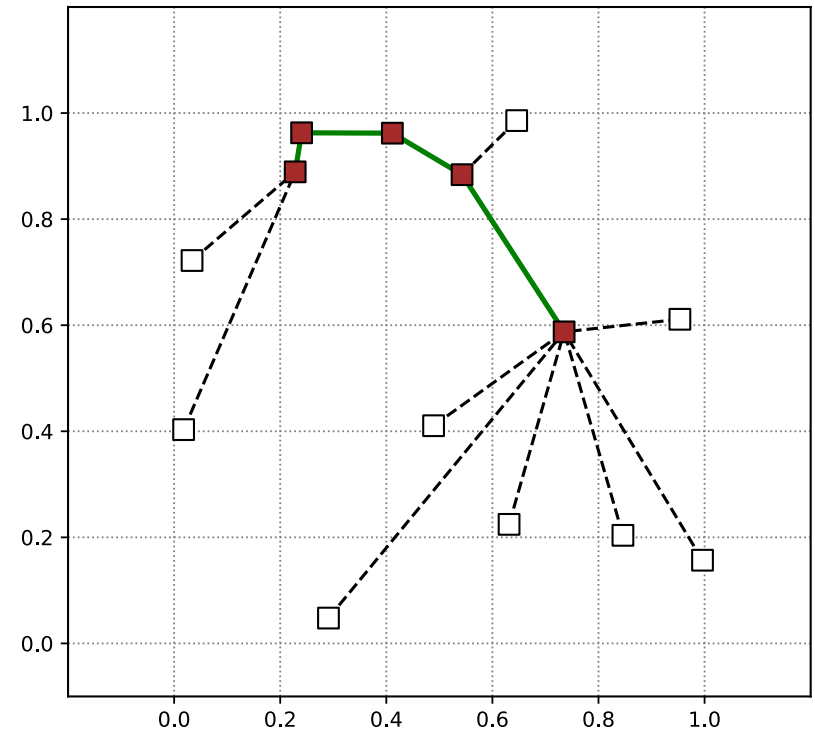


— Tree    - - - assignments    □ Customers    ■ Facilities

# Cost ordering



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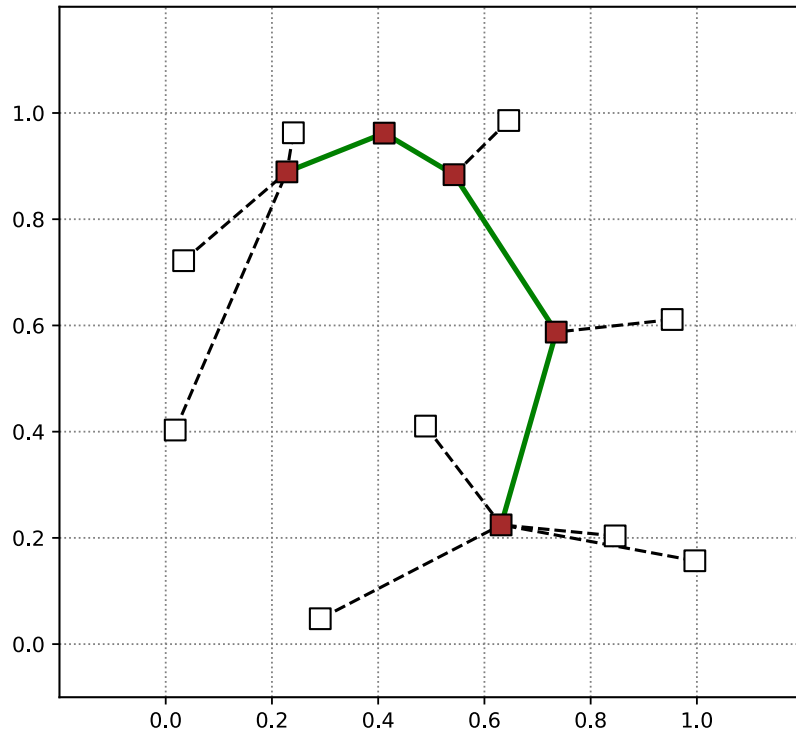


— Tree    - - - assignments    □ Customers    ■ Facilities

$$\lambda = (1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1)$$

Median criterion

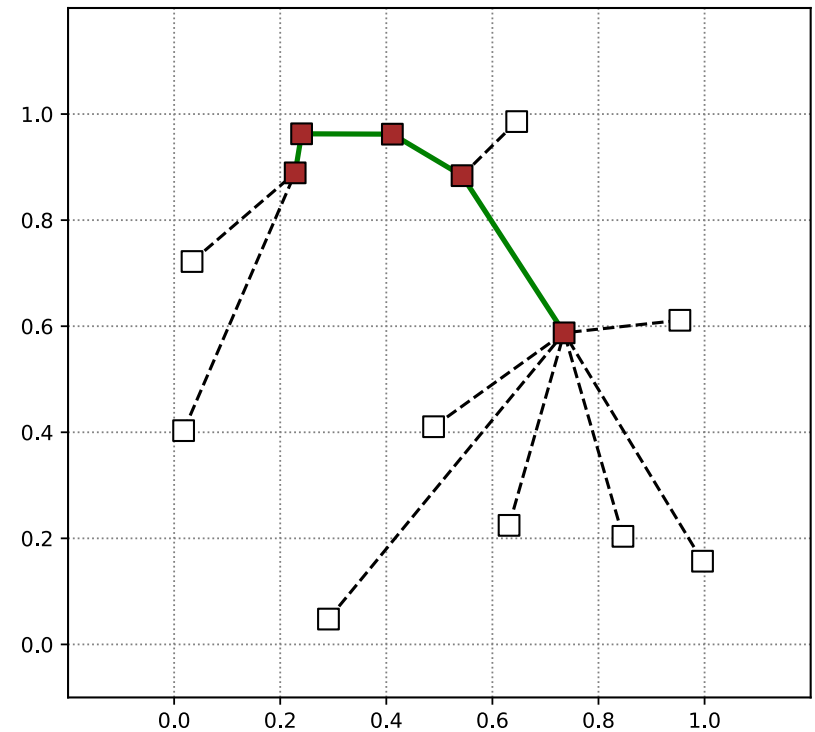
# Cost ordering



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K-centrum criterion

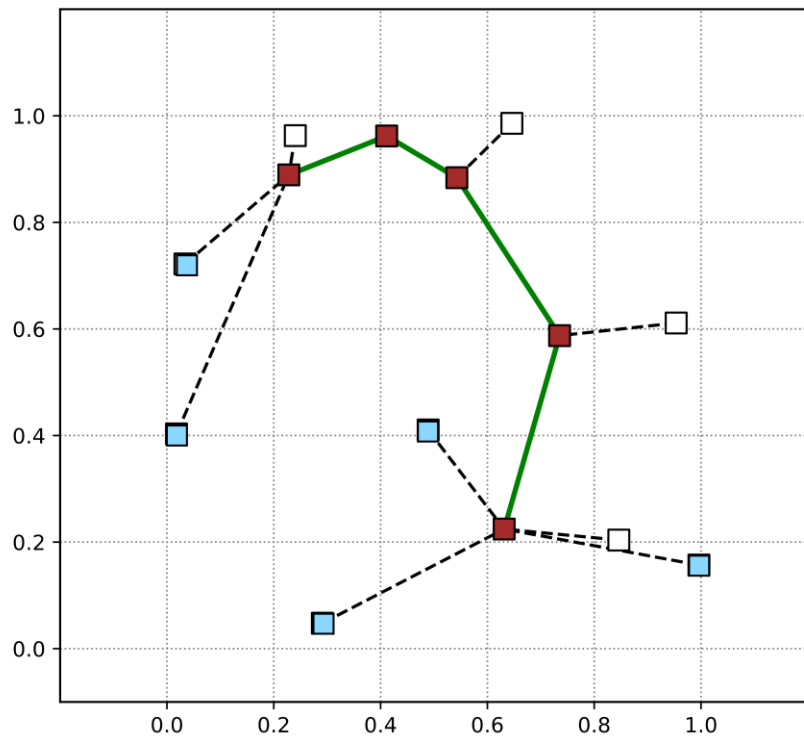


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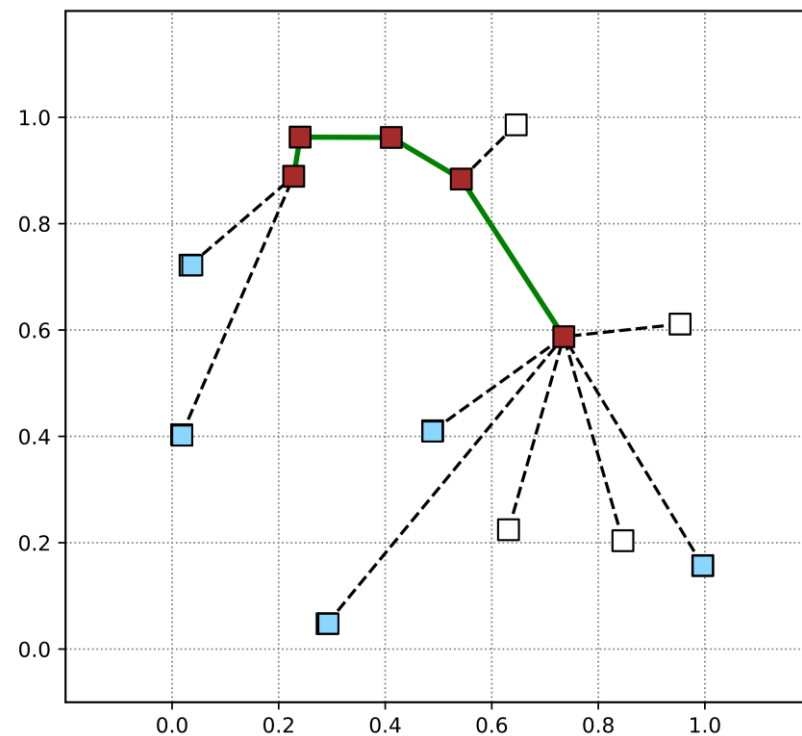
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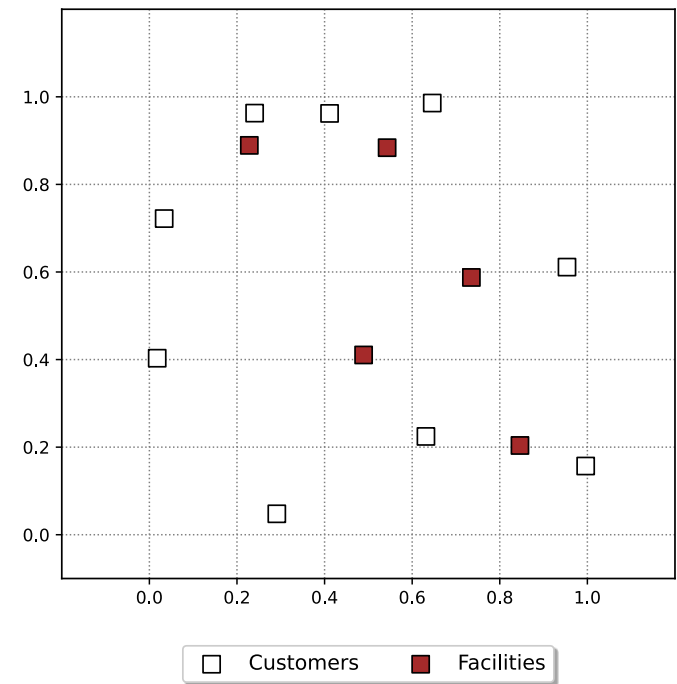
Median criterion

# Search Space Reduction

- $F1_u^{mtz}$  :  $x_{ij}, x_{ij}^\ell, z_{pq} \in \{0, 1\} \quad (i, j) \in A, \ell \in V, (p, q) \in E \quad (5)$

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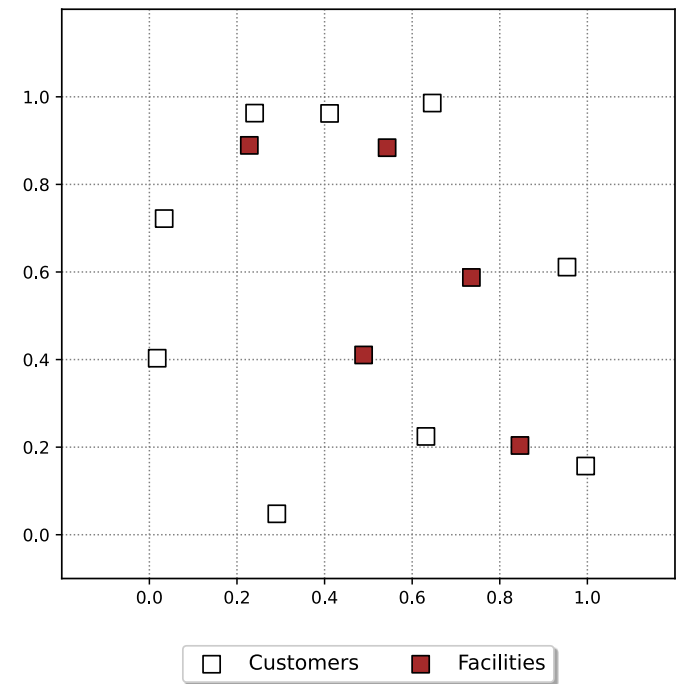


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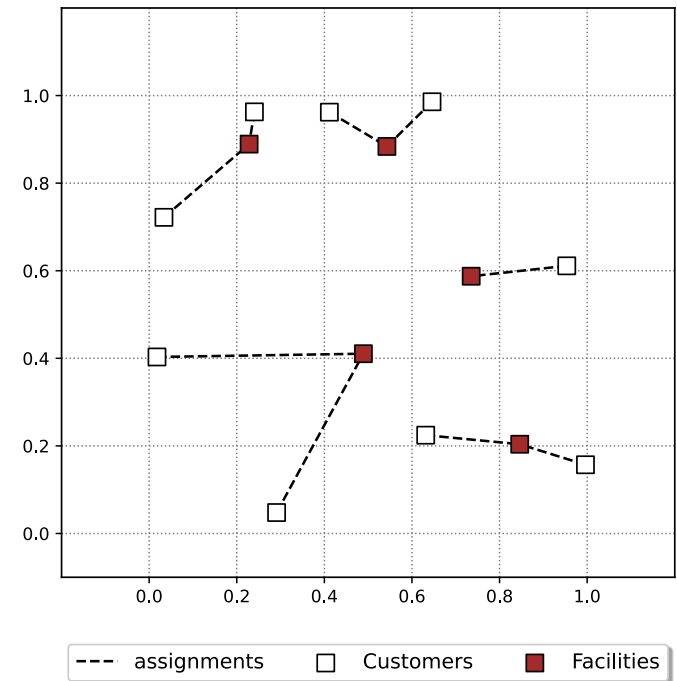
- Optimal customer assignment

- Minimum Spanning Tree (MST)



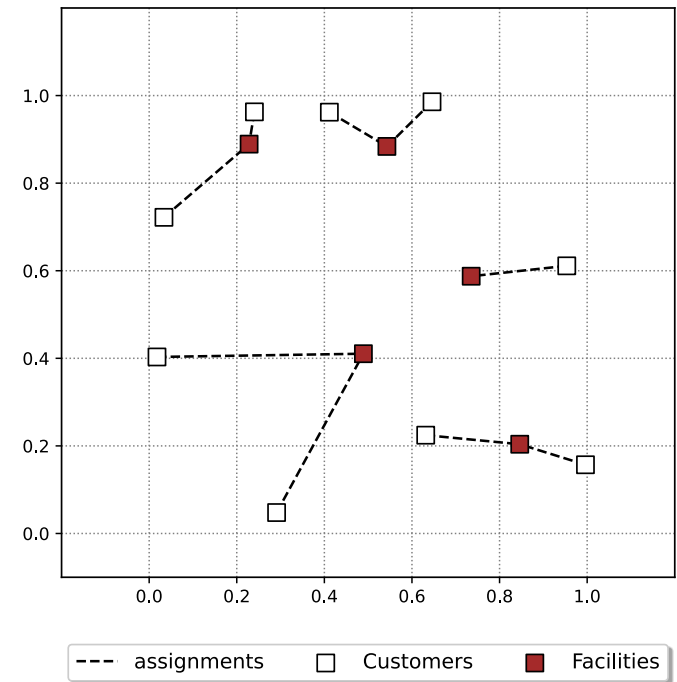
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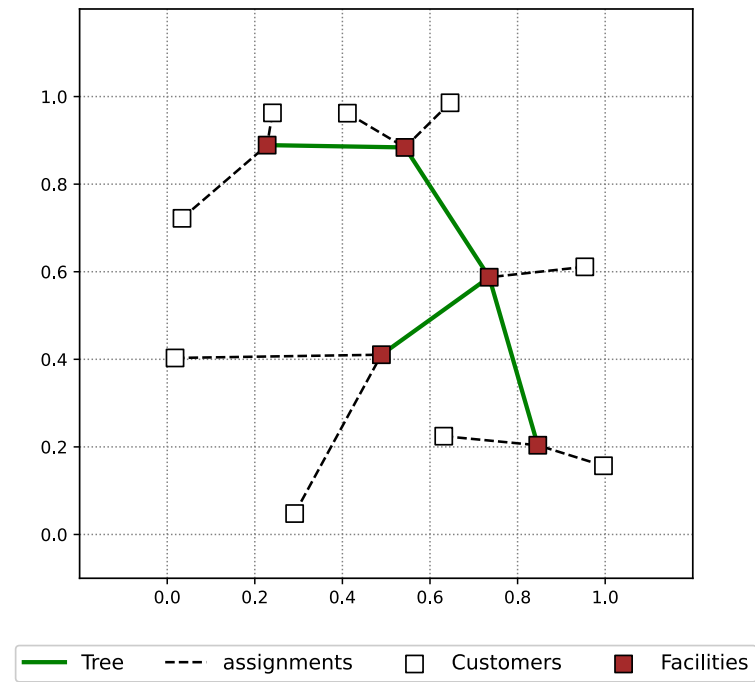
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- Assign each customer to the **closest open facility**  $\rightarrow O(|V| \cdot p)$

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- **Prim's** Algorithm  $\rightarrow O(p^2)$



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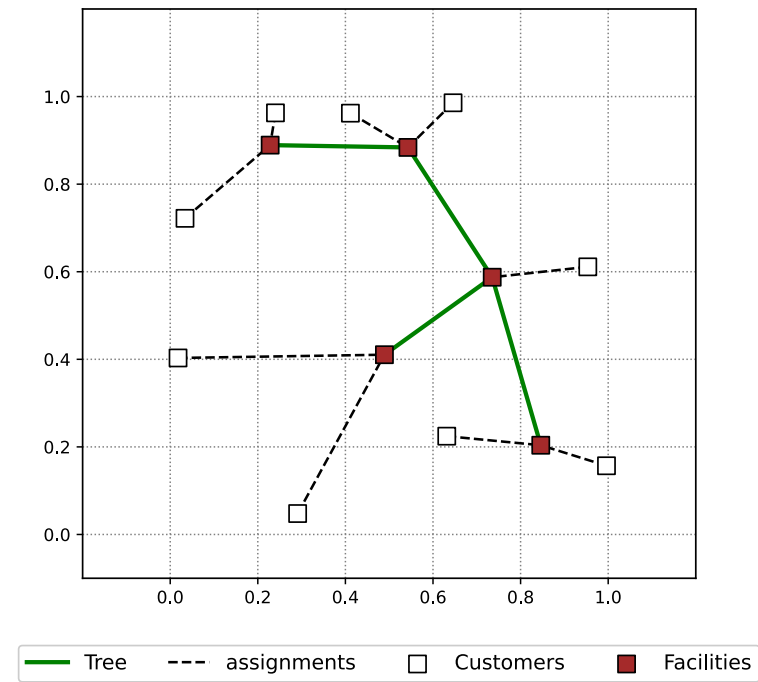
- Assign each customer to the **closest open facility**  $\rightarrow O(|V| \cdot p)$

- Minimum Spanning Tree (MST)

- **Prim's** Algorithm  $\rightarrow O(p^2)$

- Combinatorial search space

- **Facility selection**, explored by the metaheuristic proposal.



# Minimum Spanning Tree (MST)

## Prim's Algorithm

# Minimum Spanning Tree (MST)

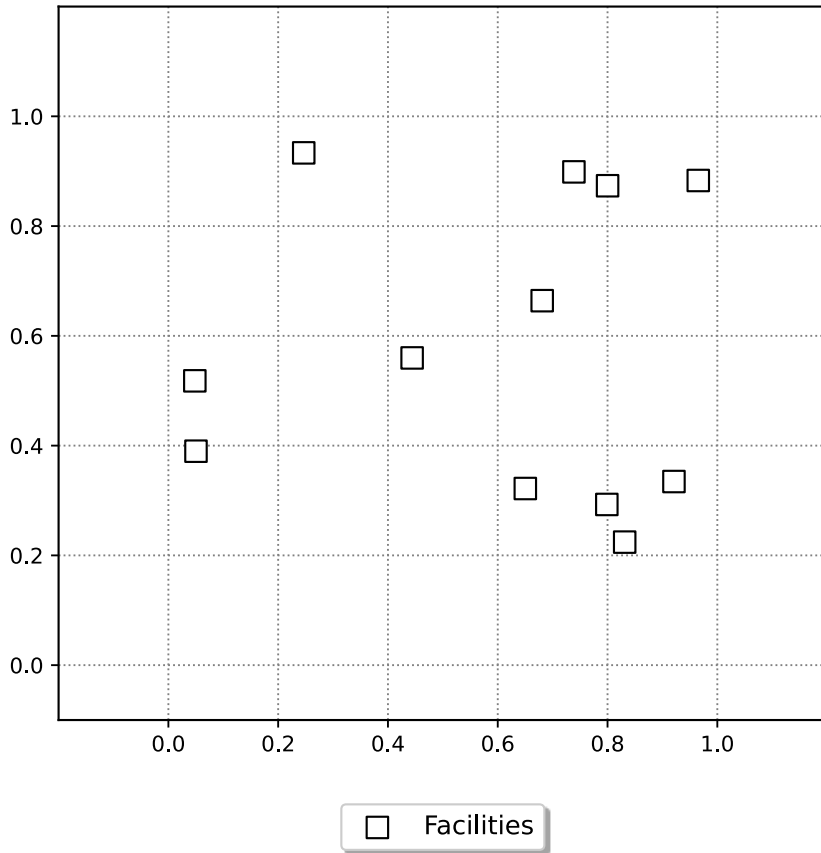
## Prim's Algorithm

- Complete graph  $\rightarrow O(p^2)$

# Minimum Spanning Tree (MST)

## Prim's Algorithm

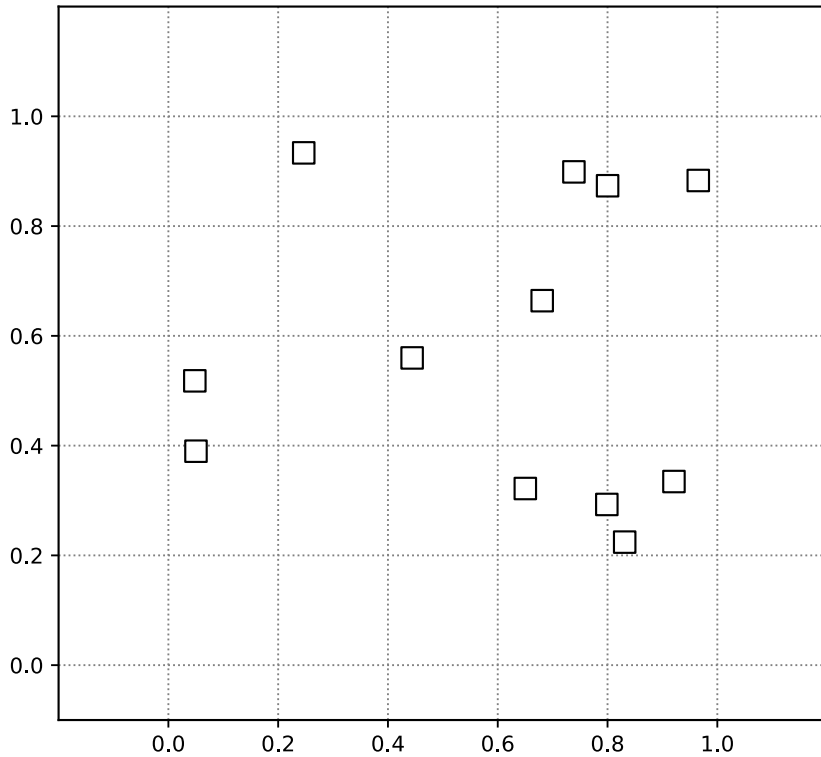
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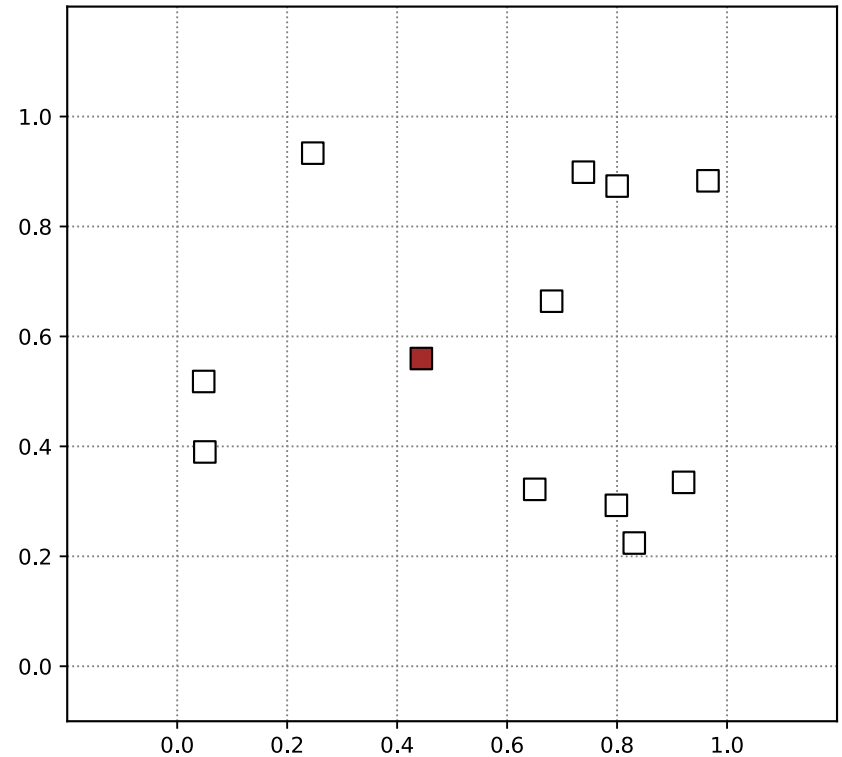
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□ Facilities

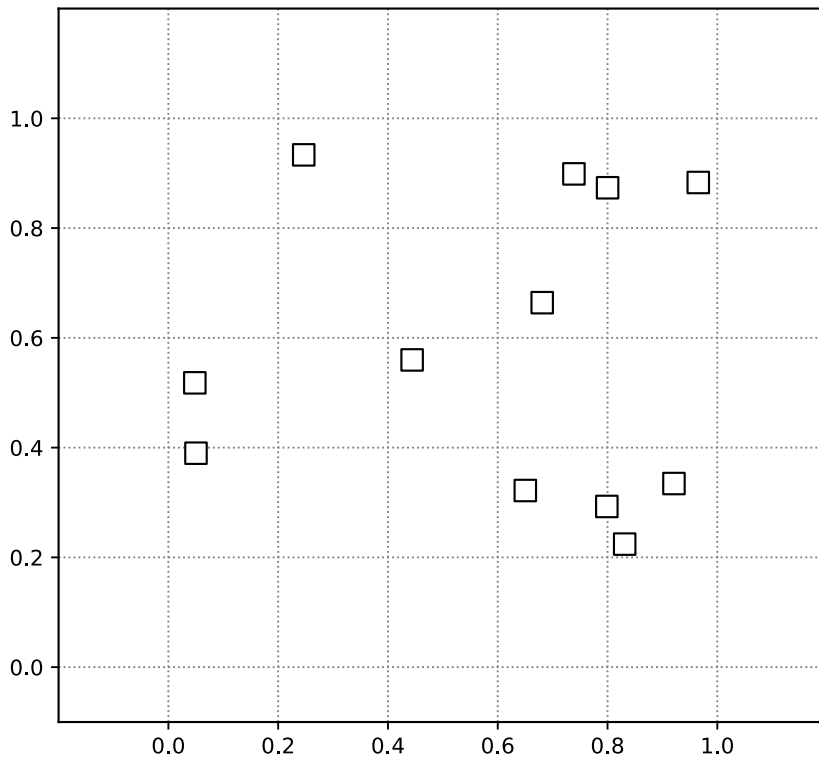


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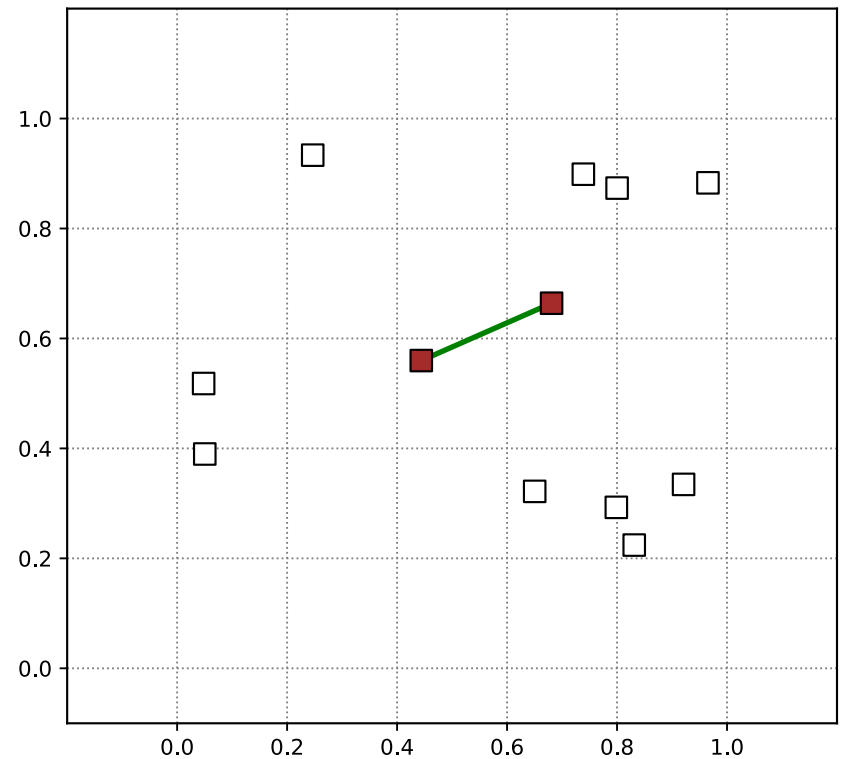
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□ Facilities

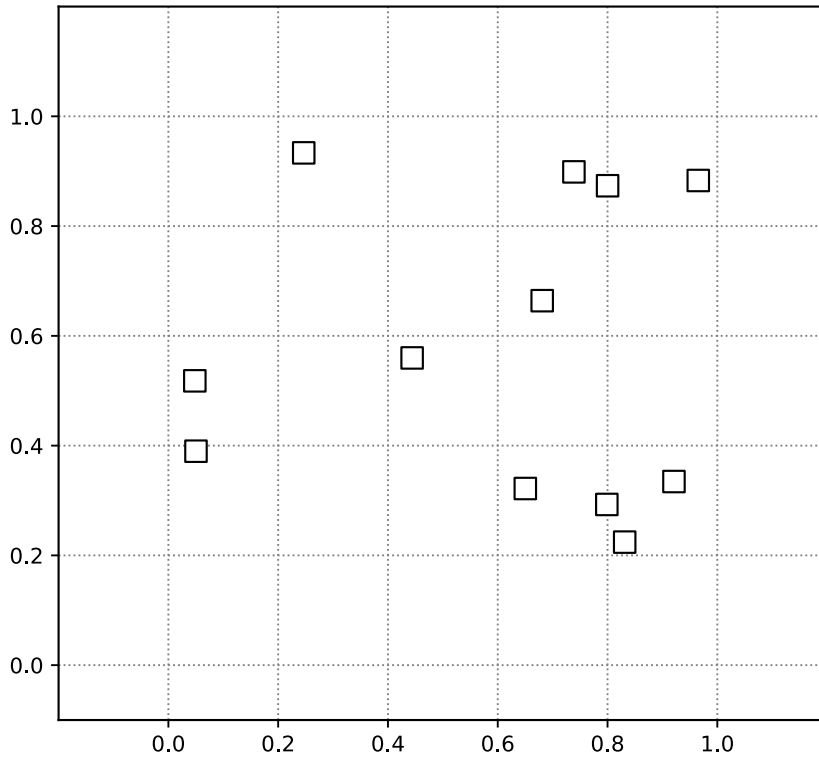


— Tree □ Facilities

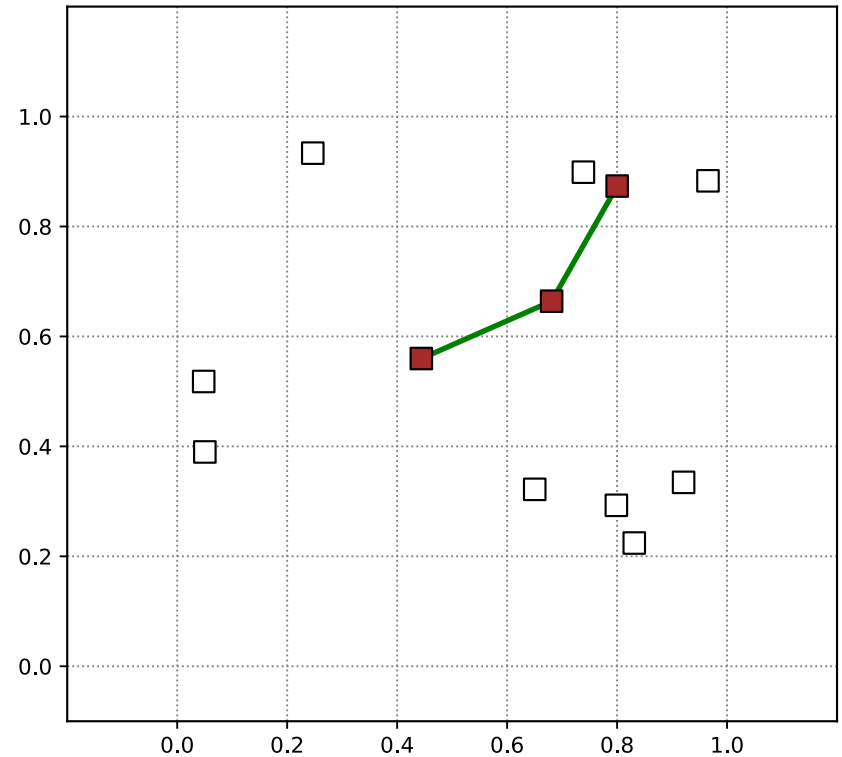
# Minimum Spanning Tree (MST)

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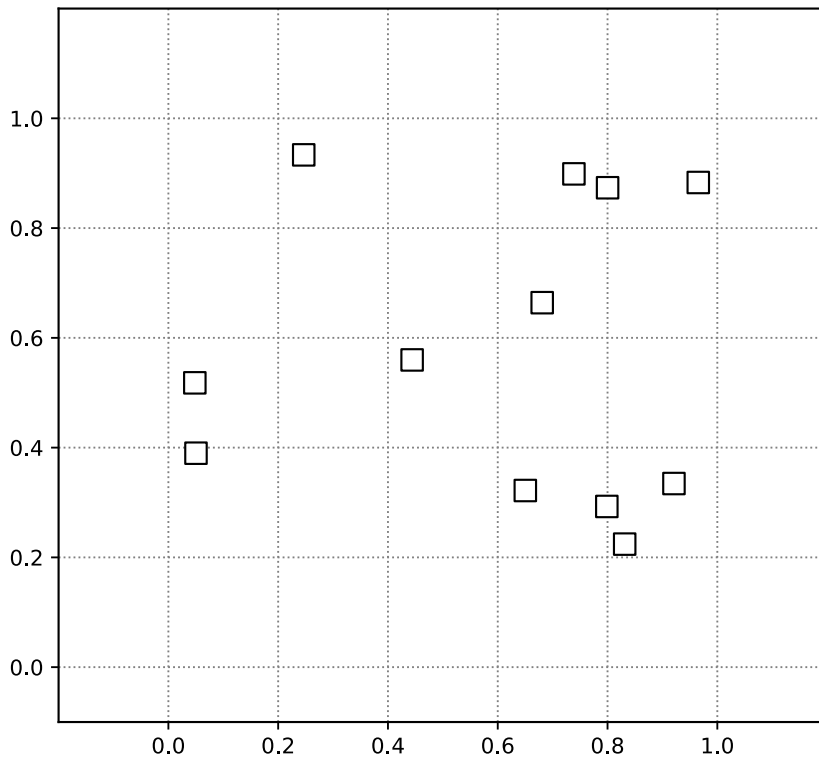


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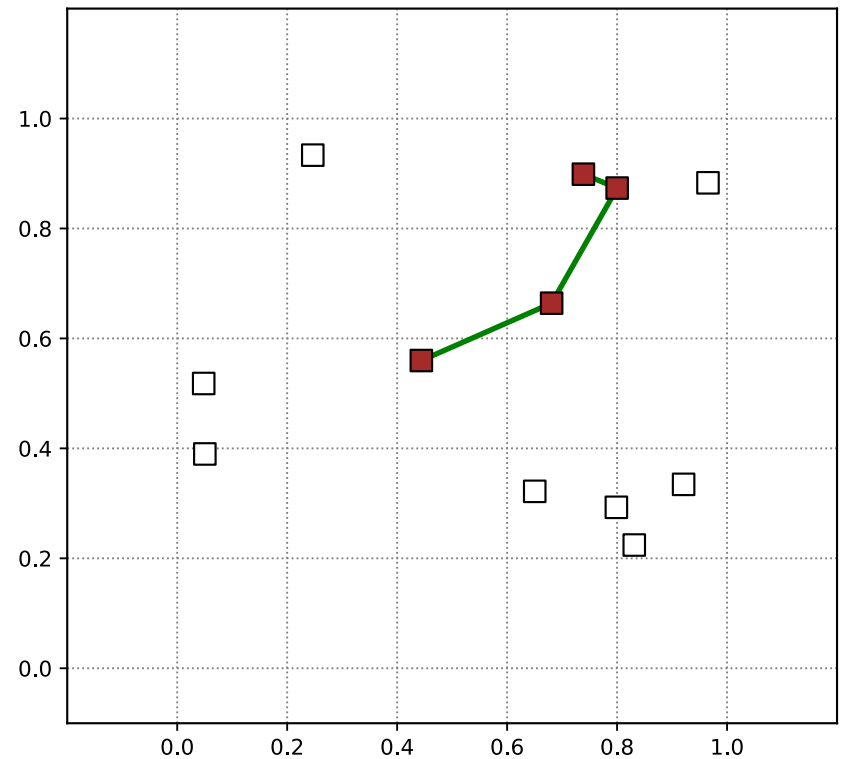
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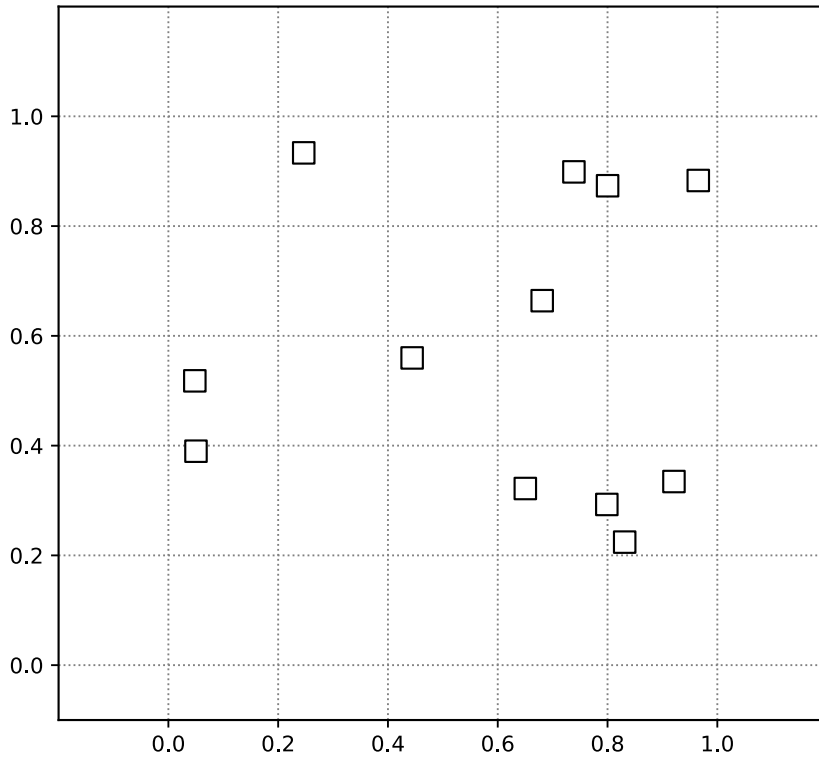


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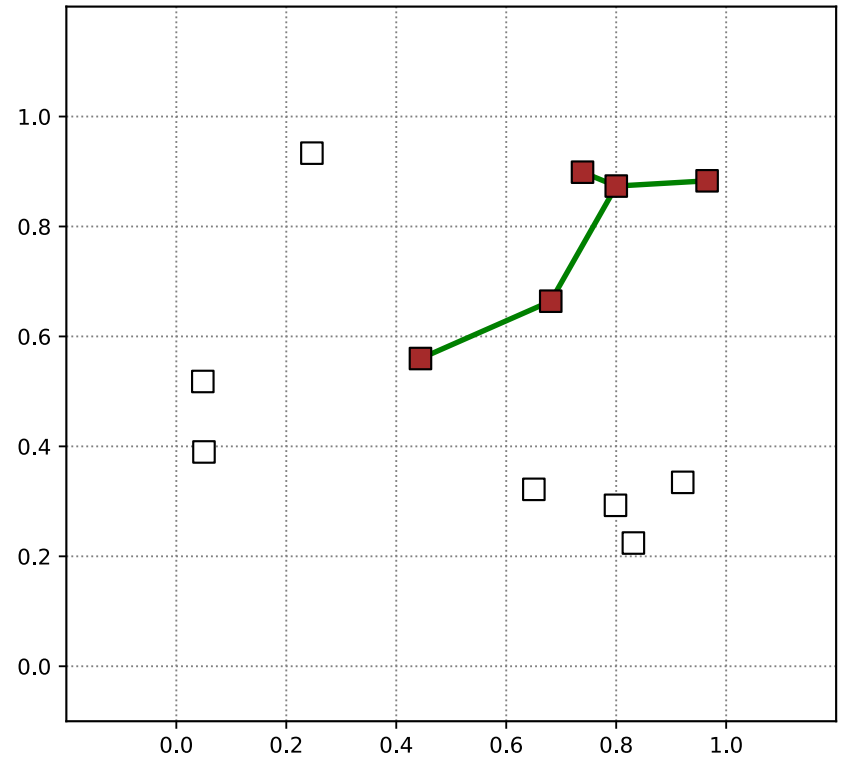
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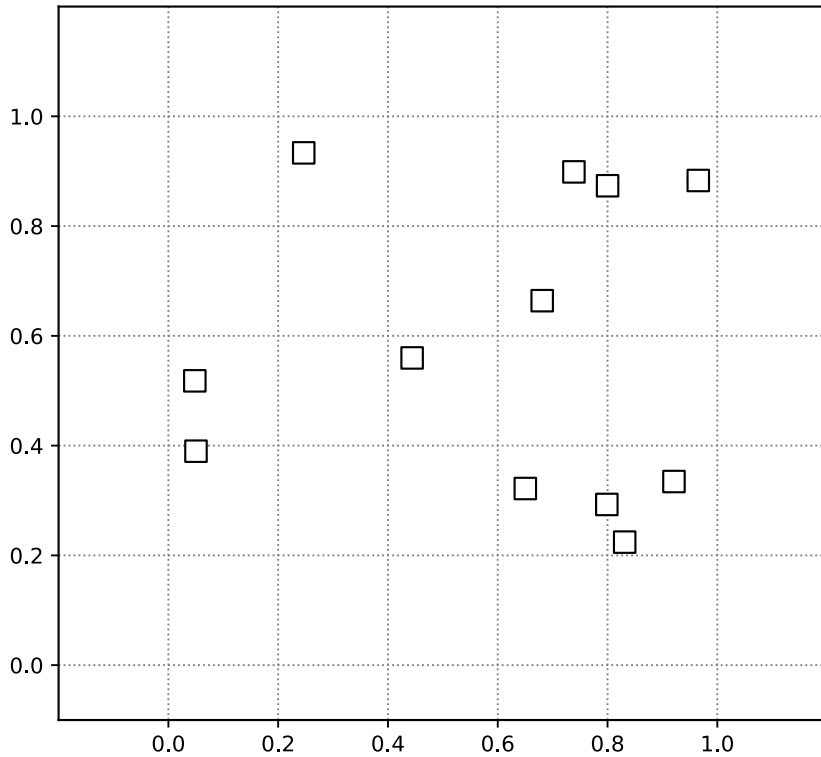


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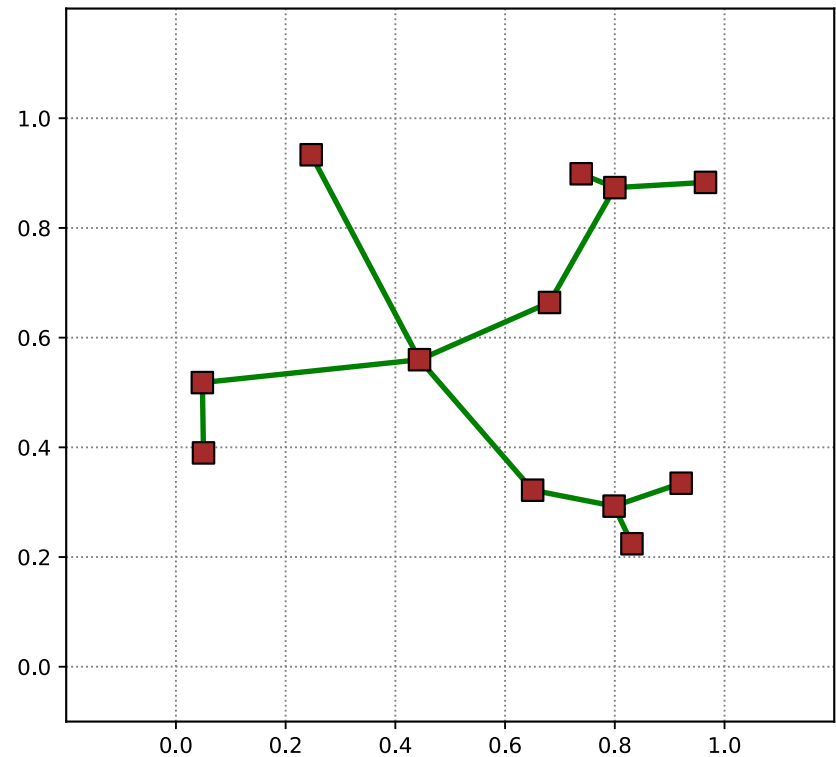
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# Proposal

- The **Greedy Randomized Adaptive Search Procedure (GRASP)** is a multi-start metaheuristic proposed in 1989 by T. A. Feo and M. G. C. Resende.

```
1 Algorithm GRASP ( $\alpha, P, N$ ):  
2    $S^* \leftarrow \emptyset$   
3   for  $i = 1 \dots N$  do  
4      $S \leftarrow \text{Construction}(\alpha, P)$   
5      $S \leftarrow \text{LocalSearch}(S)$   
6     if  $\mathcal{F}(S) < \mathcal{F}(S^*)$  then  
7        $S^* \leftarrow S$   
8   return  $S^*$ 
```


 Feo, T.A., Resende, M.G.C., 1989. A probabilistic heuristic for a computationally difficult set covering problem. Operations Research Letters 8, 67–71. [https://doi.org/10.1016/0167-6377\(89\)90002-3](https://doi.org/10.1016/0167-6377(89)90002-3)

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- The customer assignments and MST are obtained **efficiently**.

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- **GRASP** focuses only on **facility selection**.

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# Proposal

- Objective-function-based construction heuristic  $\mathcal{F}'$

$$\mathcal{F}(\phi, I) = \frac{1}{\sum_{\ell \in V} \lambda_{\ell}} \sum_{\ell \in V} \sum_{(i,j) \in A} \lambda_{\ell} c_{ij} x_{ij}^{\ell} + \frac{1}{p-1} \sum_{(i,j) \in E} c_{ij} z_{ij} \quad (1)$$

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$$\mathcal{F}'(\phi, I, u) = \frac{1}{\sum_{\ell \in V} \lambda_{\ell}} \sum_{\ell \in V} \sum_{(i,j) \in A} \lambda_{\ell} c_{ij} x_{ij}^{\ell} + \min_{v \in \mathcal{G}^{-1}(\phi) \setminus u} c_{uv} \quad (2)$$

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# Results

- **Programming languages:** Java 25, Python 3.8, and Gurobi 11.
- **Server specifications:** AMD EPYC 7282 limited to 32 virtual CPU cores and 32 GB of RAM.
- **Instances:** 105 Median, 105 k-center, 105 k-trimmed (20–100 nodes, 5–50 **p** facilities).
- **Metrics:**
  - $\mathcal{F}$ : value of the objective function.
  - **Time (s):** execution time in seconds.
  - **Dev (%)**: deviation from the best value found.
  - **# Best:** total number of instances in which the algorithm obtains the best solution in the experiment.

# Results

Table 1: Comparison between the exact formulation  $F1_u^{mtz}$  and GRASP.

Criterion	Algorithm	$\mathcal{F}$	Time (s)	Dev (%)	# Best
Median	$F1_u^{mtz}$	4,985.91	1,114.94	0.029798	129
	GRASP	<b>4,984.93</b>	<b>3.97</b>	<b>0.000000</b>	<b>135</b>
$k$ -Centrum	$F1_u^{mtz}$	8,706.09*	2,559.81	0.644954*	93
	GRASP	<b>8,631.98</b>	<b>4.26</b>	<b>0.000000</b>	<b>135</b>
$k$ -Trimmed Mean	$F1_u^{mtz}$	3,531.95*	1,388.04	0.054605*	123
	GRASP	<b>3,520.00</b>	<b>4.05</b>	<b>0.000000</b>	<b>135</b>
Aggregated	$F1_u^{mtz}$	5,732.06*	1,687.59	0.241589*	345
	GRASP	<b>5,712.30</b>	<b>4.09</b>	<b>0.000000</b>	<b>405</b>

# Conclusions and future work



- **GRASP** identifies the **best solutions** from the set of instances.
- The metaheuristic approach improves the **performance** and reduces **computation time** compared to models.



- Expand the **dataset**.
- Explore **machine learning** methods (GNN) to guide the search.
- Implement dynamic **MST updates**.
- Enhance the **GRASP improvement phase**.

# Acknowledgments

This work was funded by:

- **Ministerio de Ciencia e Innovación:** ref. PID2021-126605NB-I00, PID2021-125709OA-C22 and PID2024-156045NB-I00 financed by MCIN /AEI /10.13039/501100011033 y por ERDF A way of making Europe, y ref. FPU24/01134.
- **CIRMA:** “This work has been supported by Comunidad Autónoma de Madrid, CIRMA-CM Project (TEC-2024/COM-404)”.
- **Cátedra ENIA:** Ministerio para la Transformación Digital y de la Función Pública (Ref. TSI-100930-2023-3).



FPU24/01134

# Ordered Median Tree Location Problem (OMT)



FPU24/01134

16th Metaheuristics International Conference

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Abraham Duarte, J. Manuel Colmenar**

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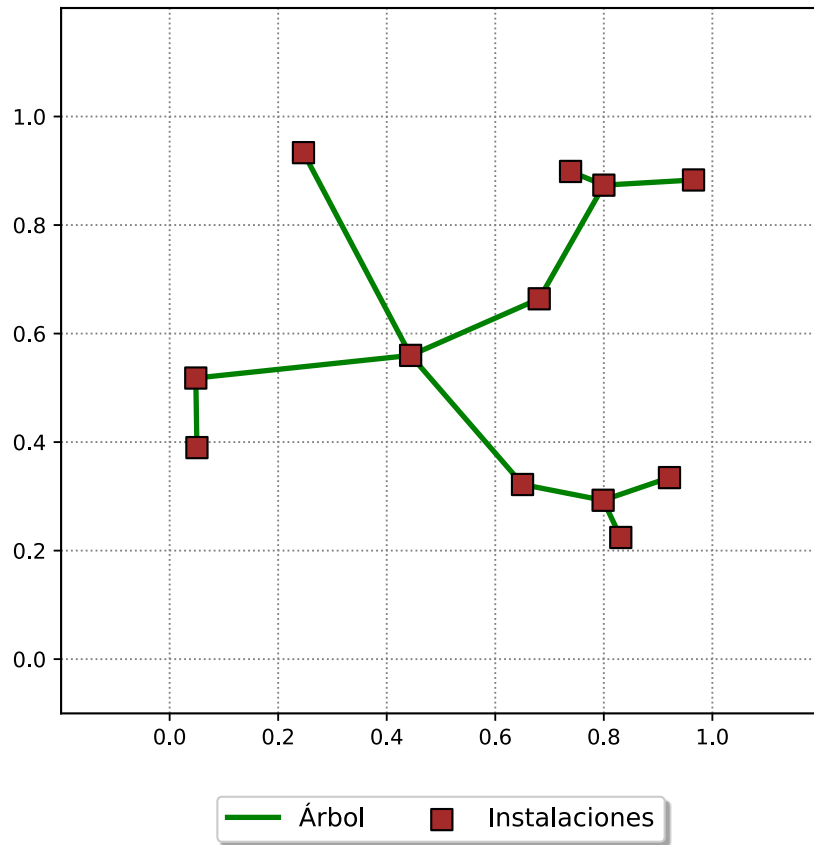
josemanuel.colmenar@urjc.es



Universidad  
Rey Juan Carlos

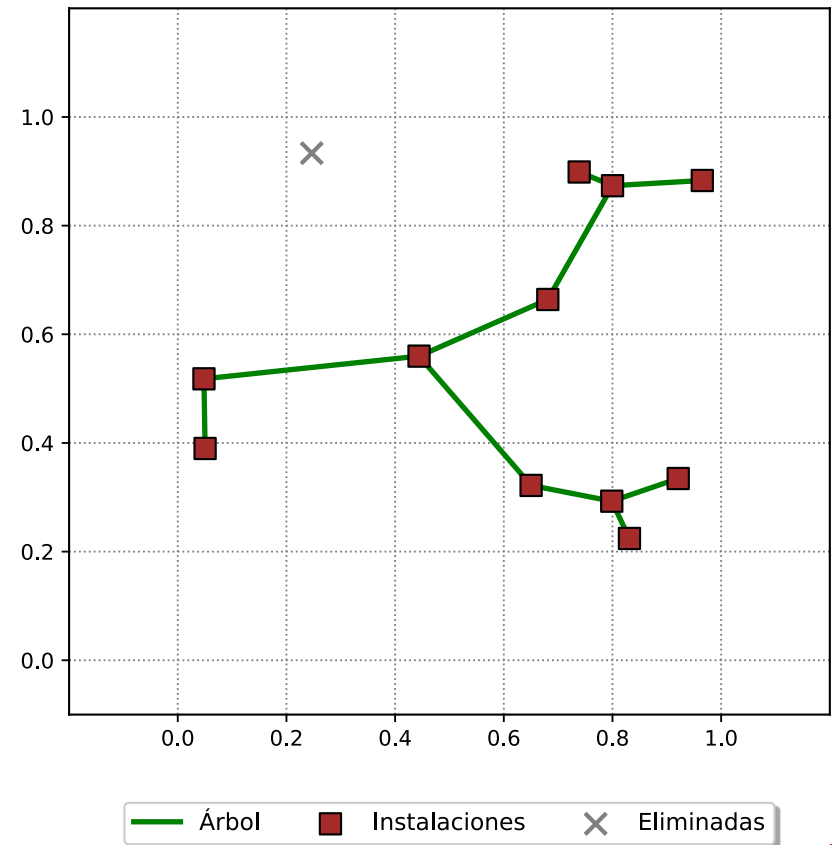
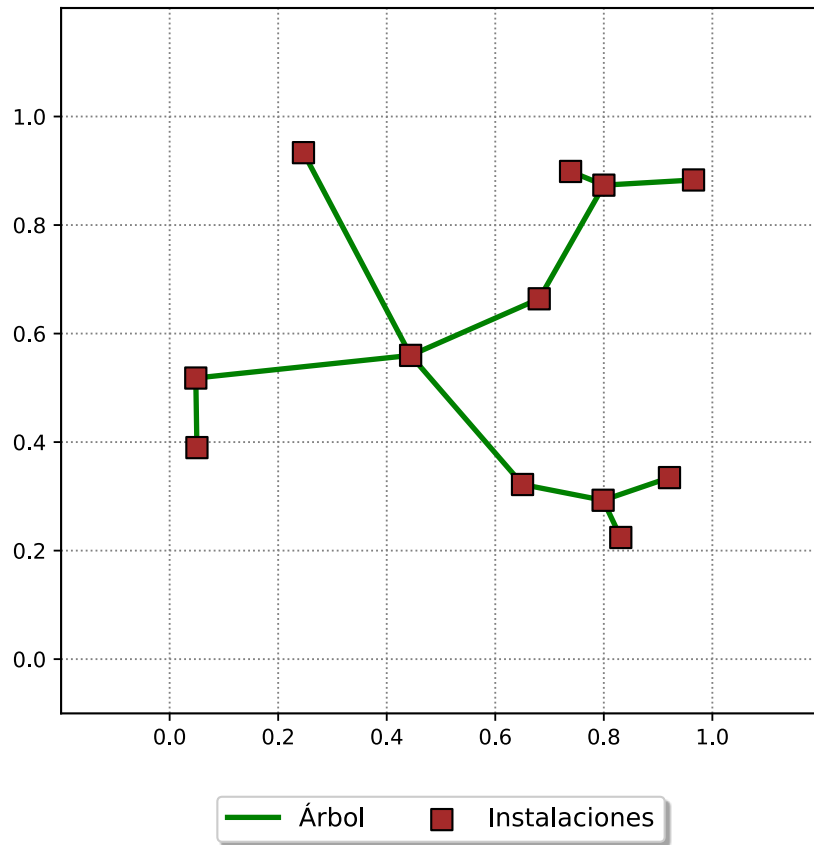
# Dynamic MST updates

## 1) Leaf node



# Dynamic MST updates

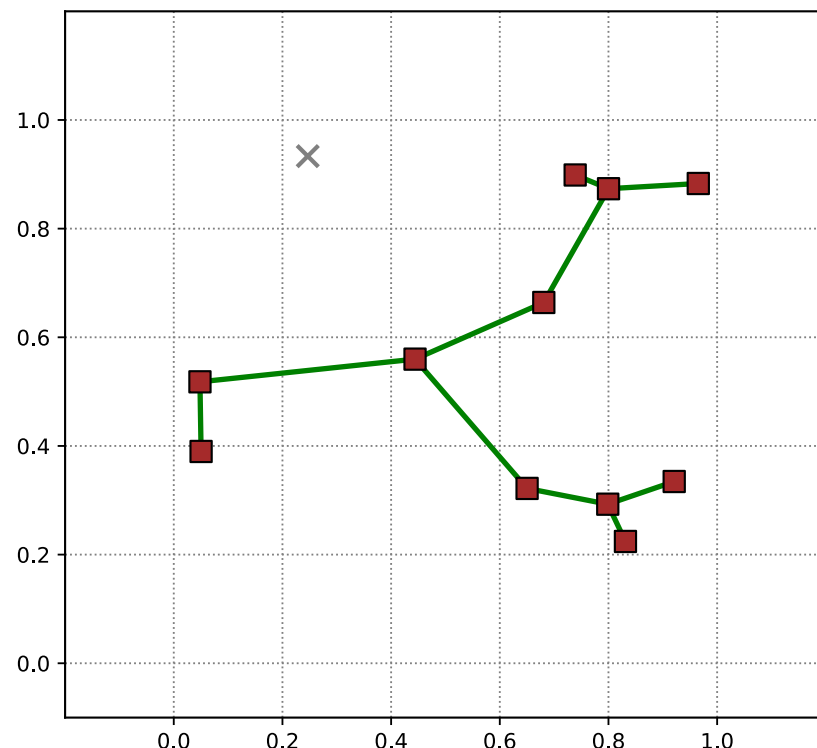
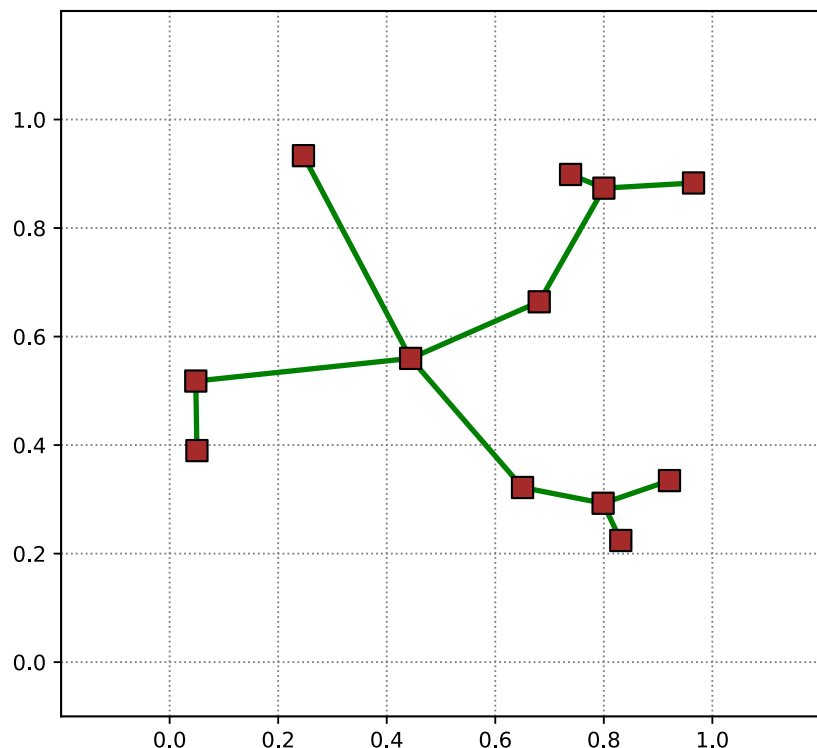
## 1) Leaf node



# Dynamic MST updates

## 1) Leaf node

•  $O(p^2) \rightarrow O(1)$

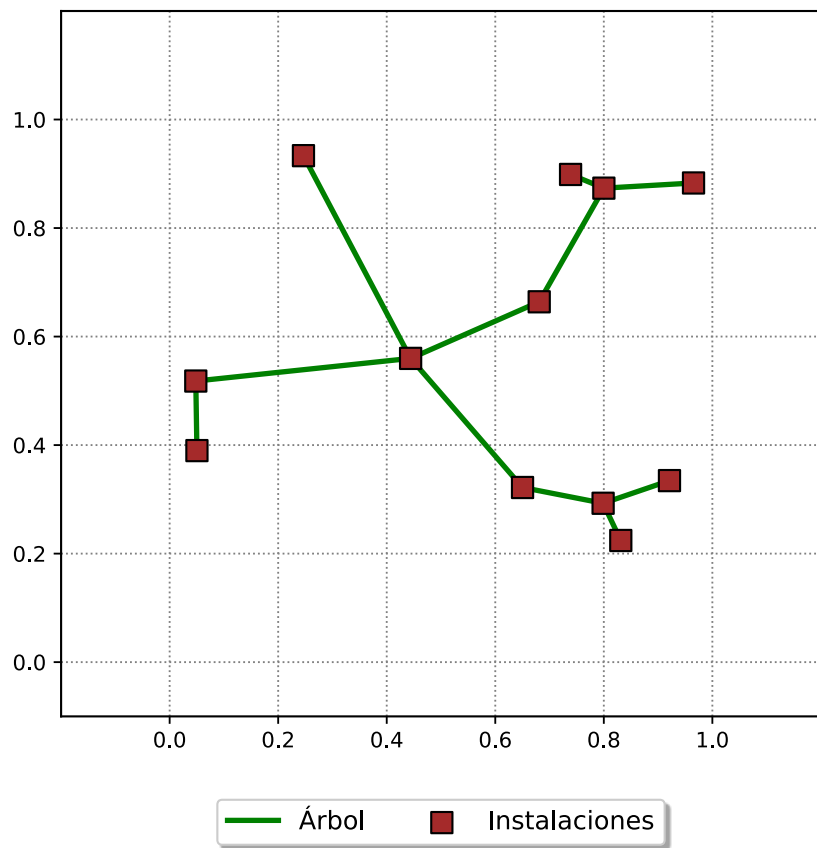


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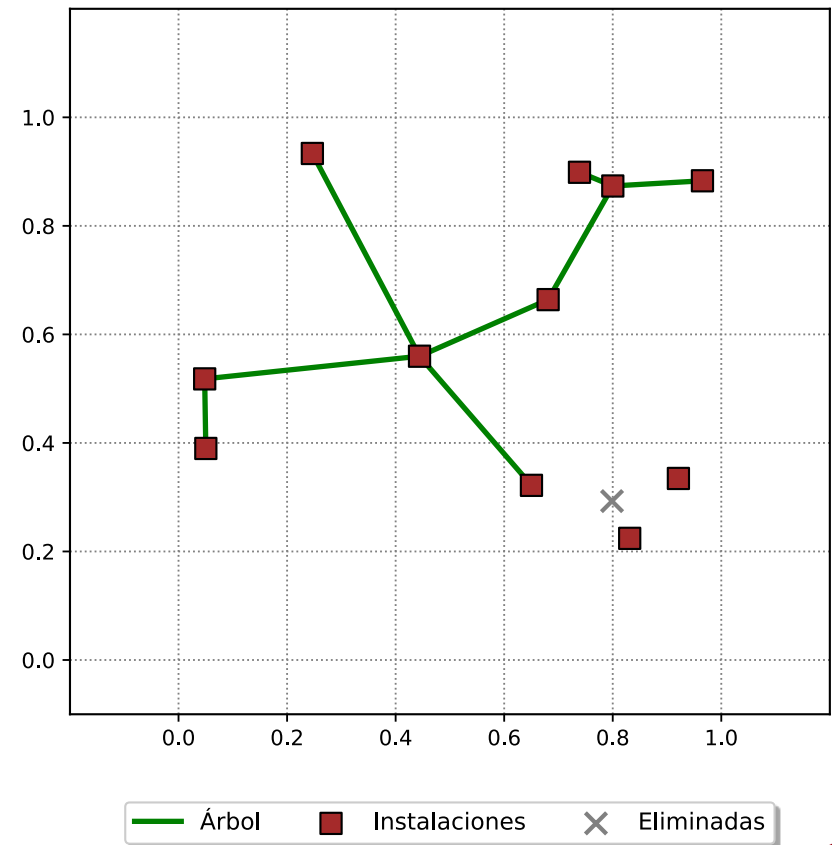
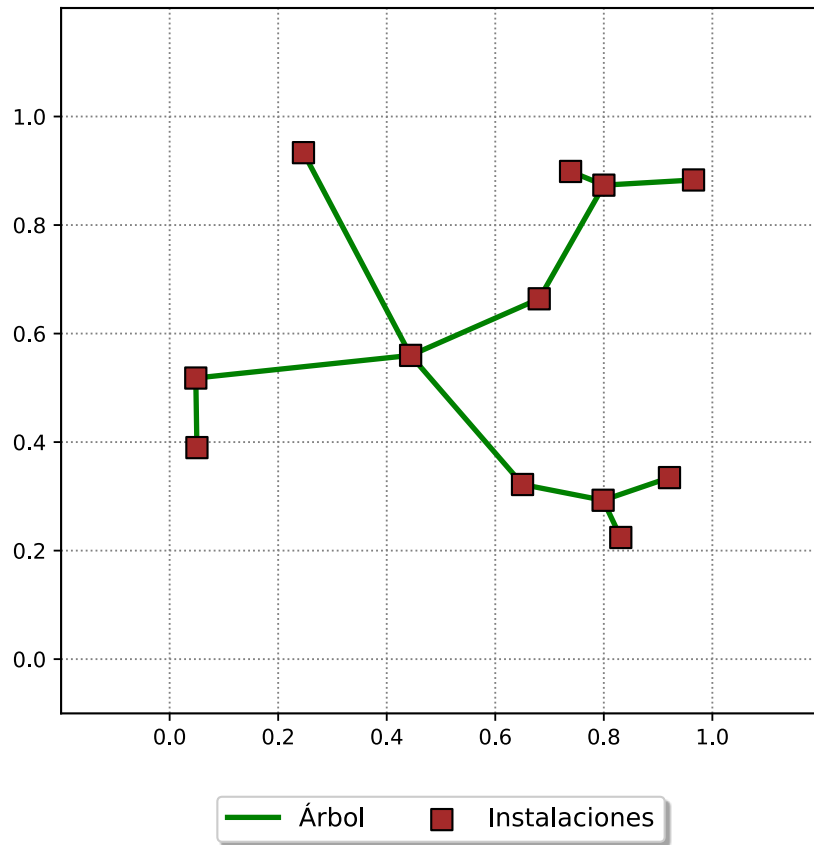
# Dynamic MST updates

## 2) Unique connected component



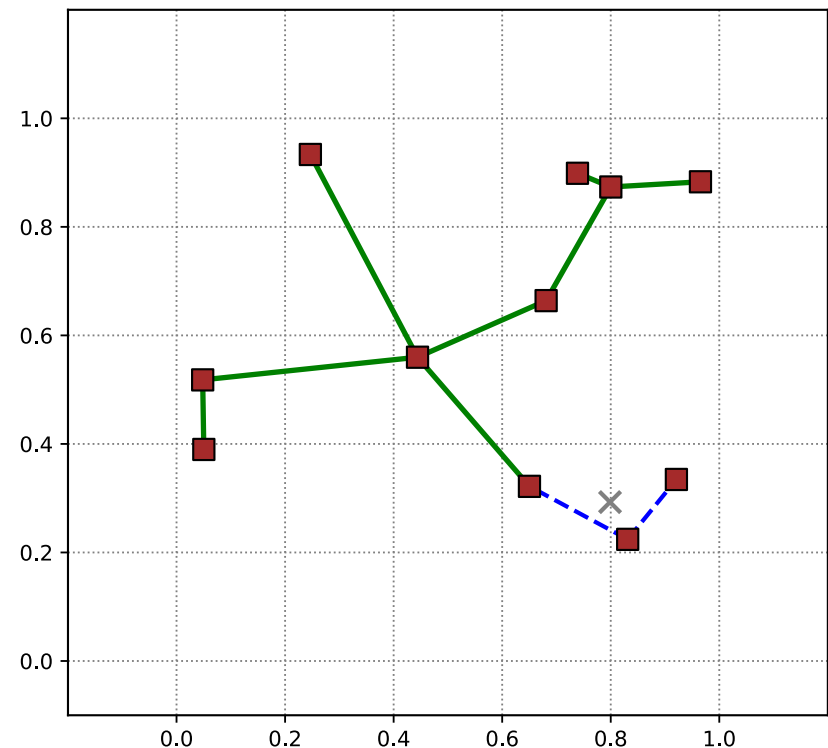
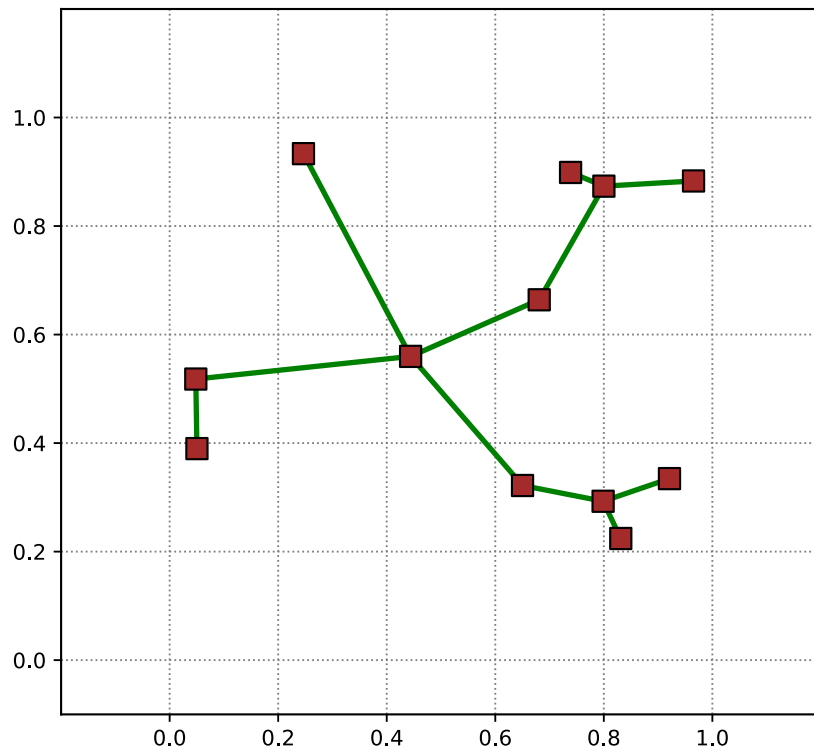
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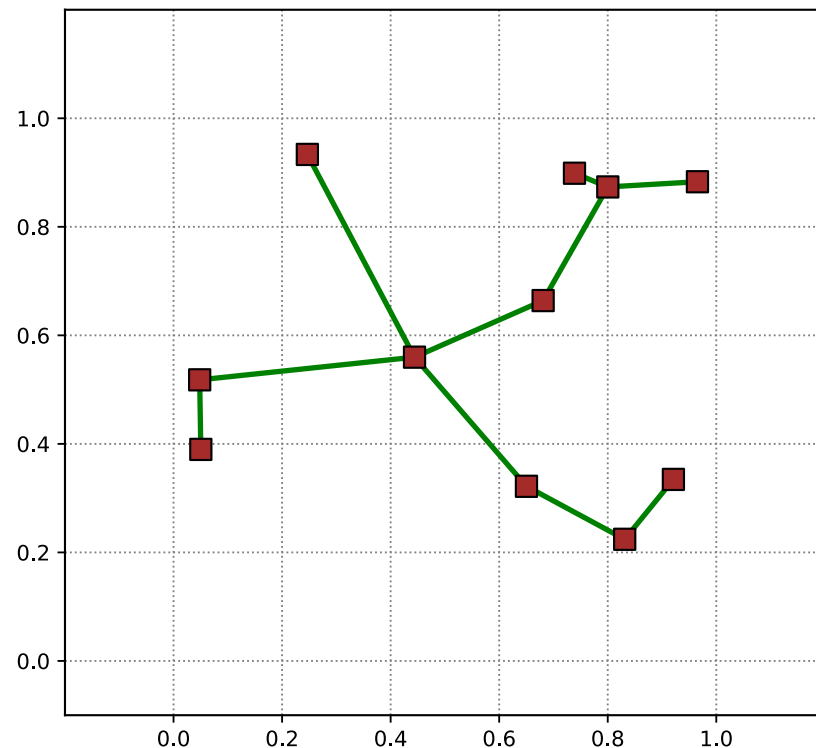
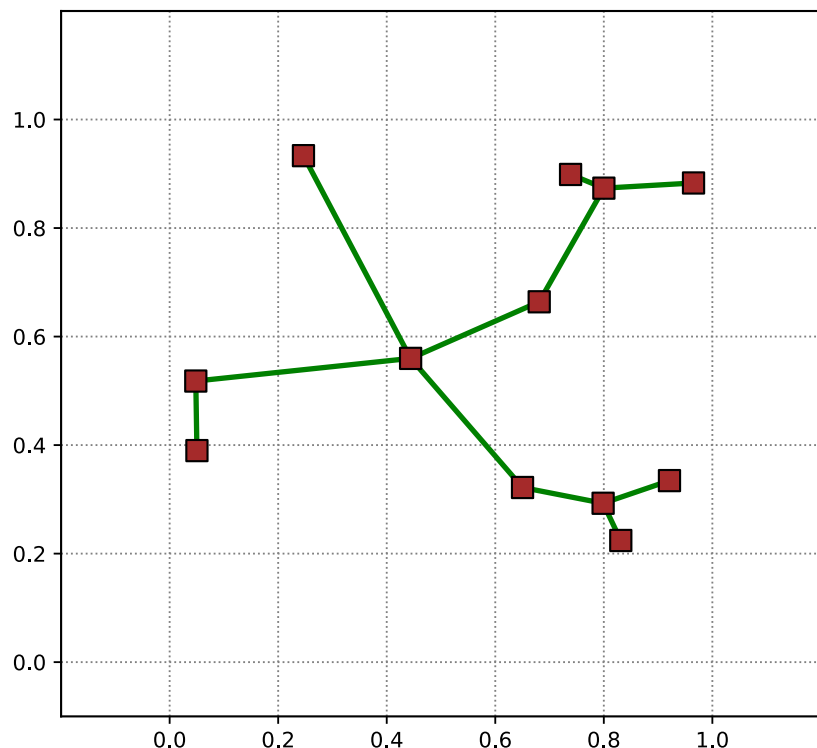
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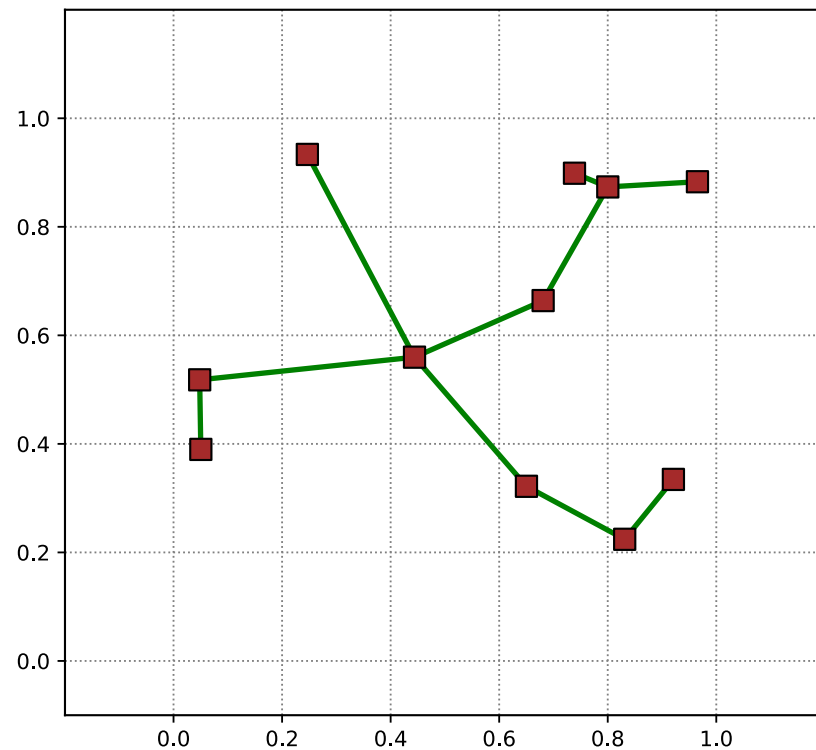
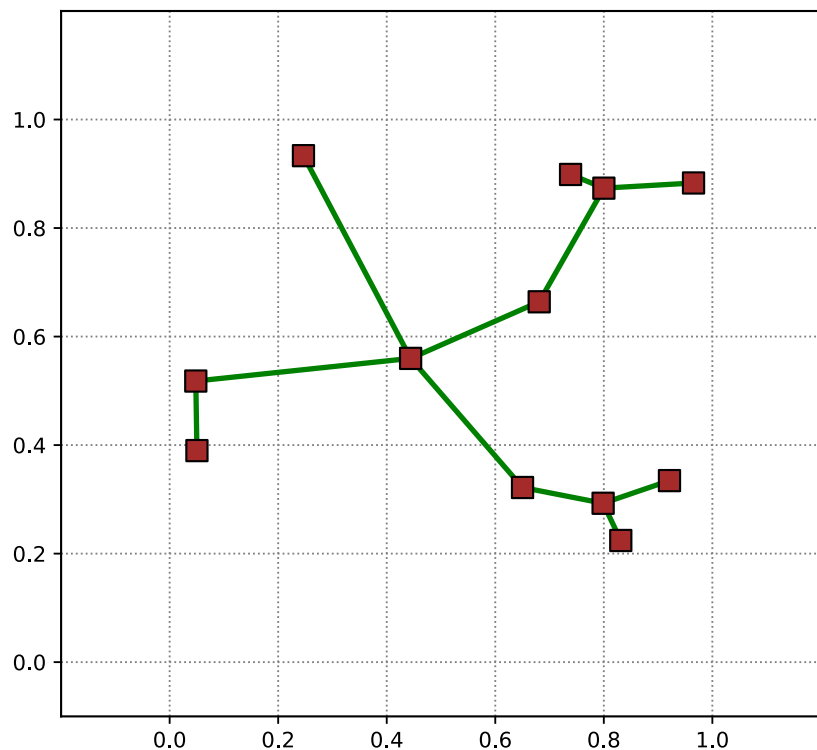


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2) Unique connected component •  $O(p^2) \rightarrow O(K \cdot p)$

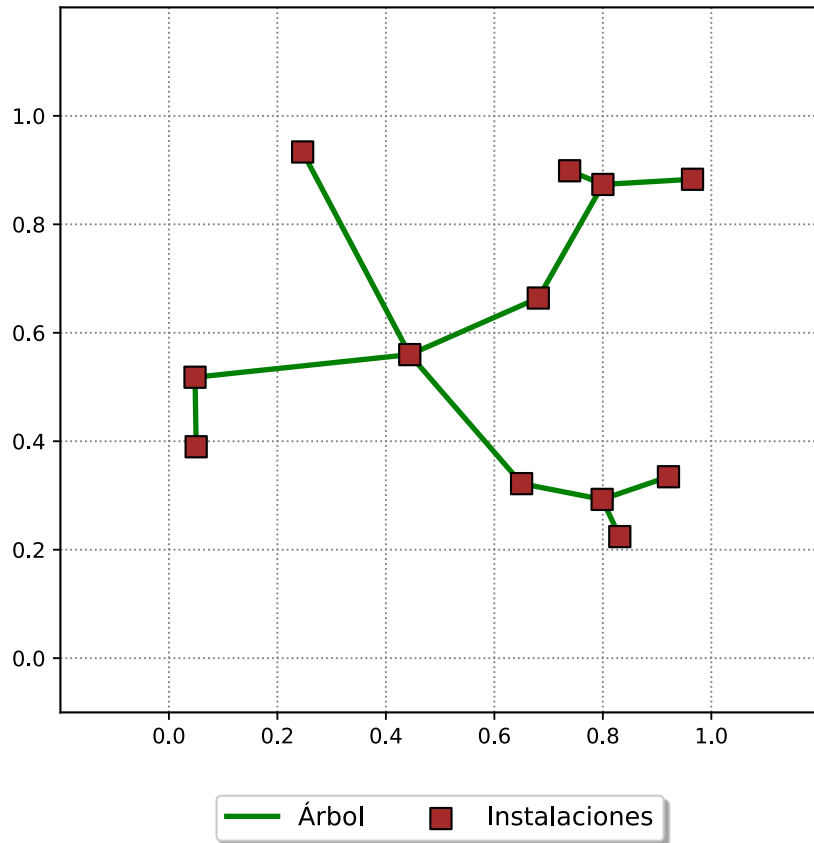


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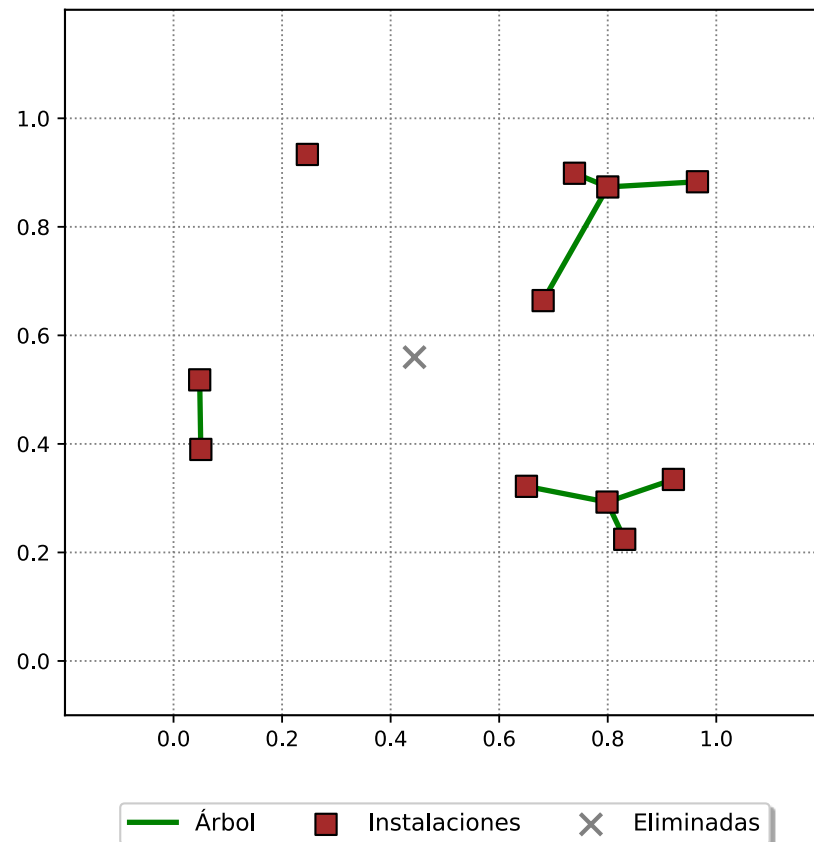
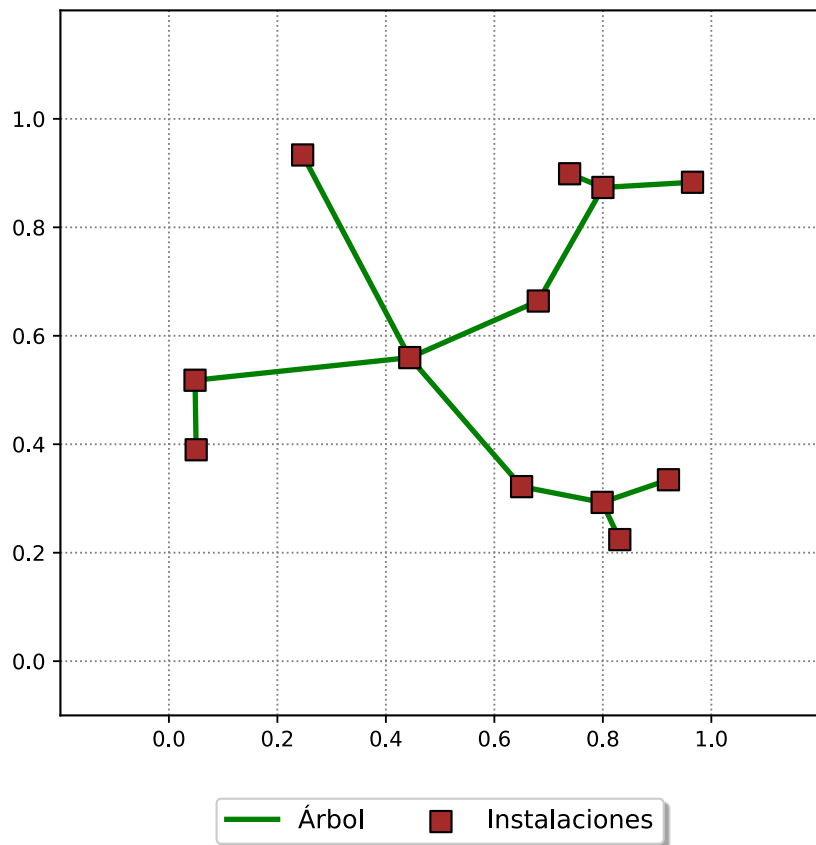
# Dynamic MST updates

## 3) General Case



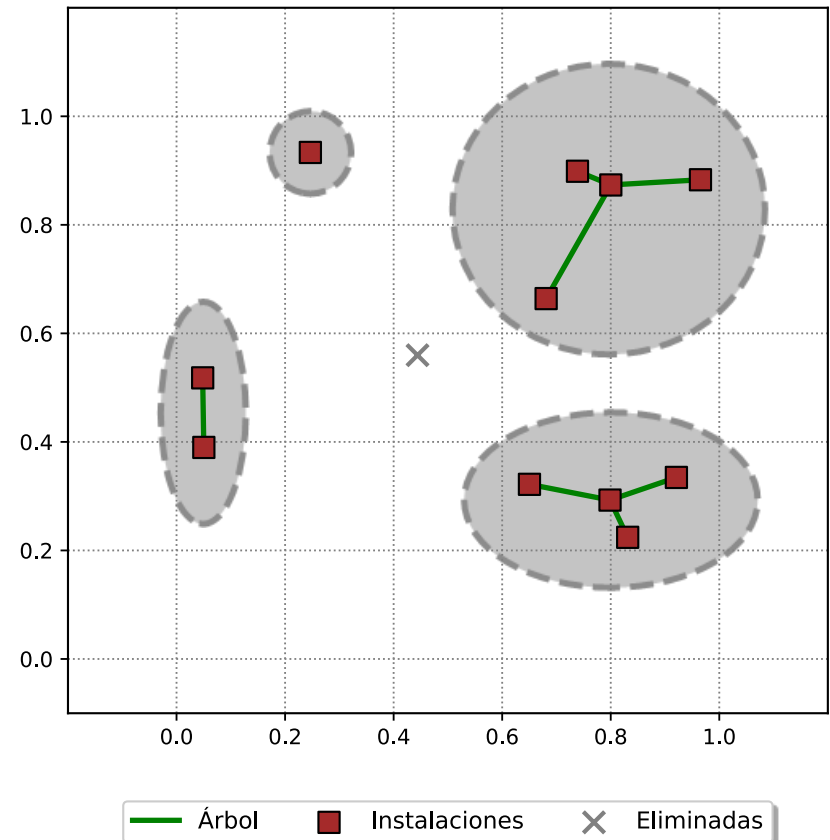
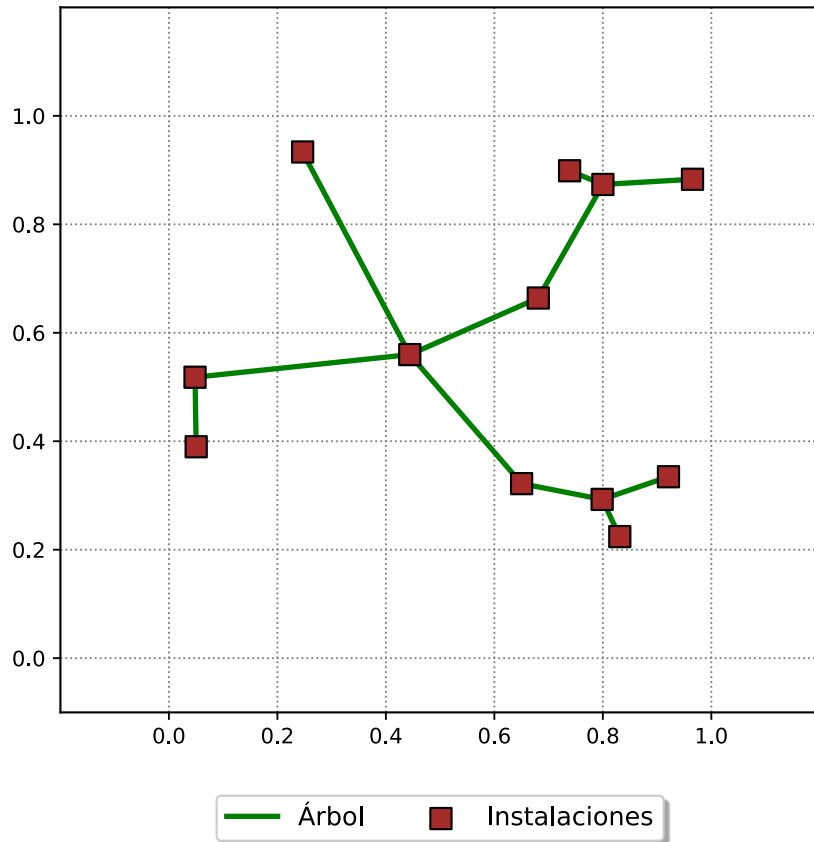
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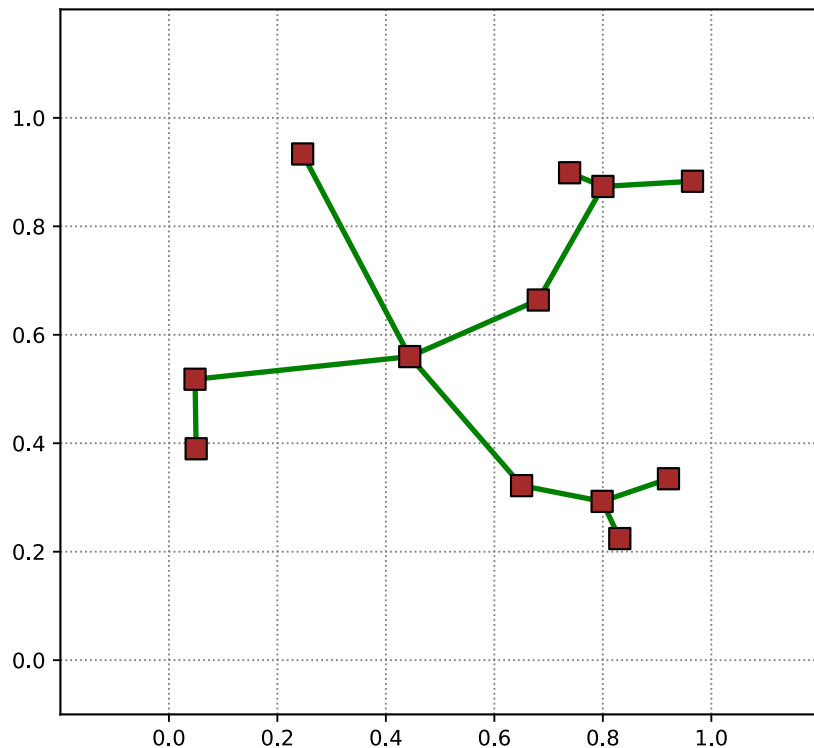
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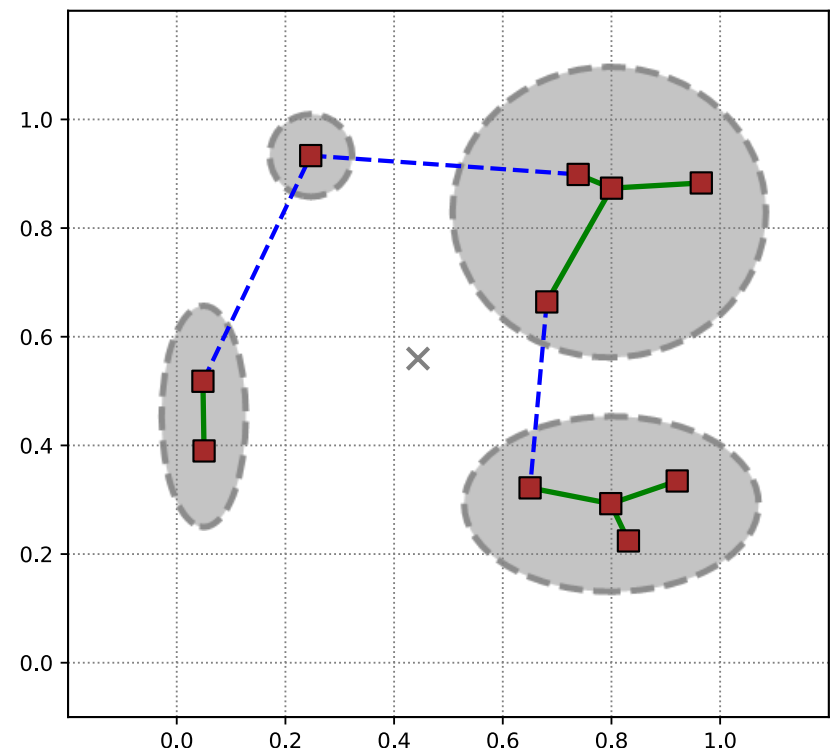


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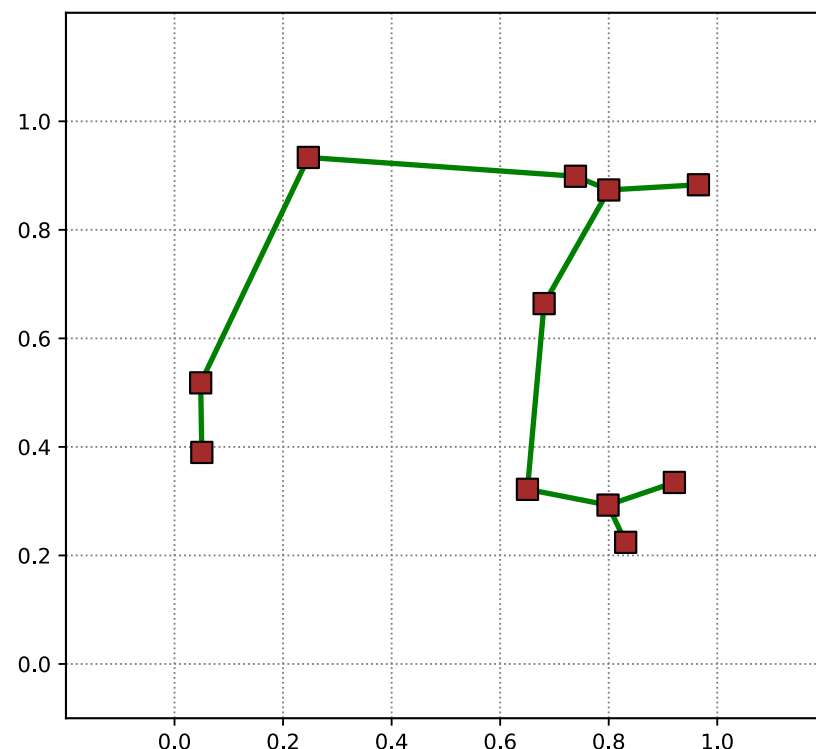
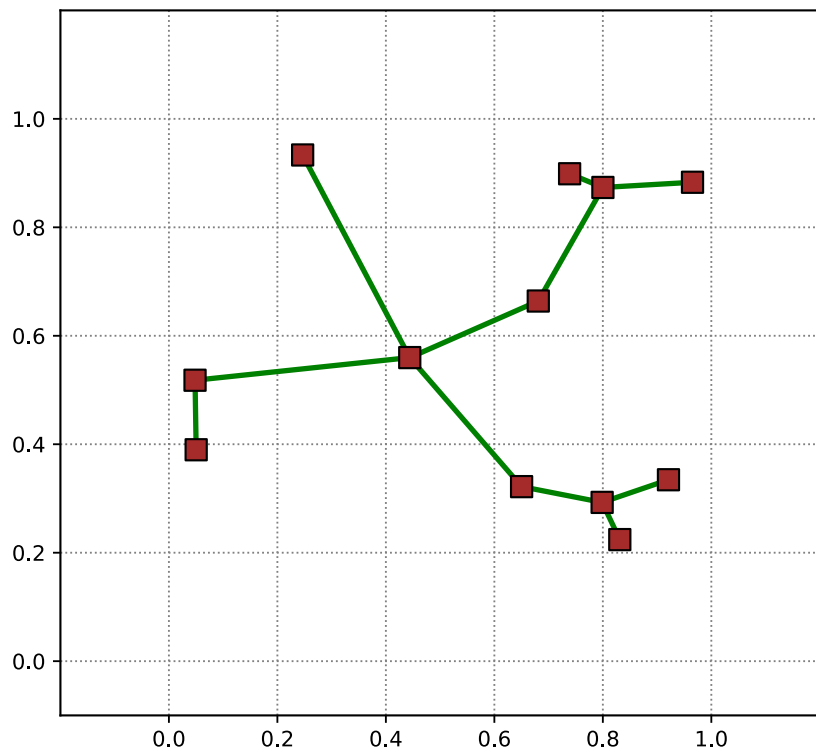
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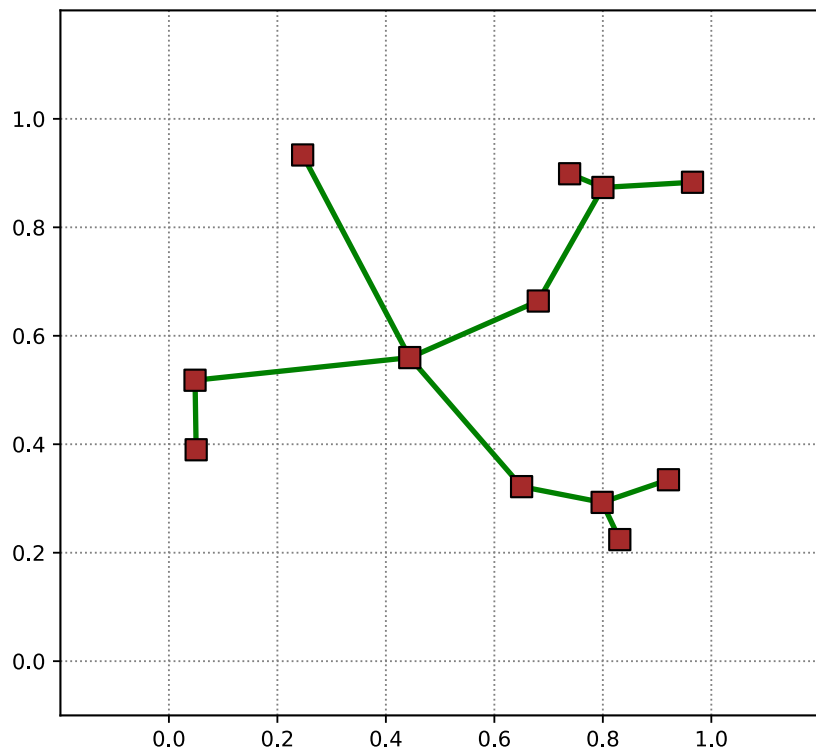
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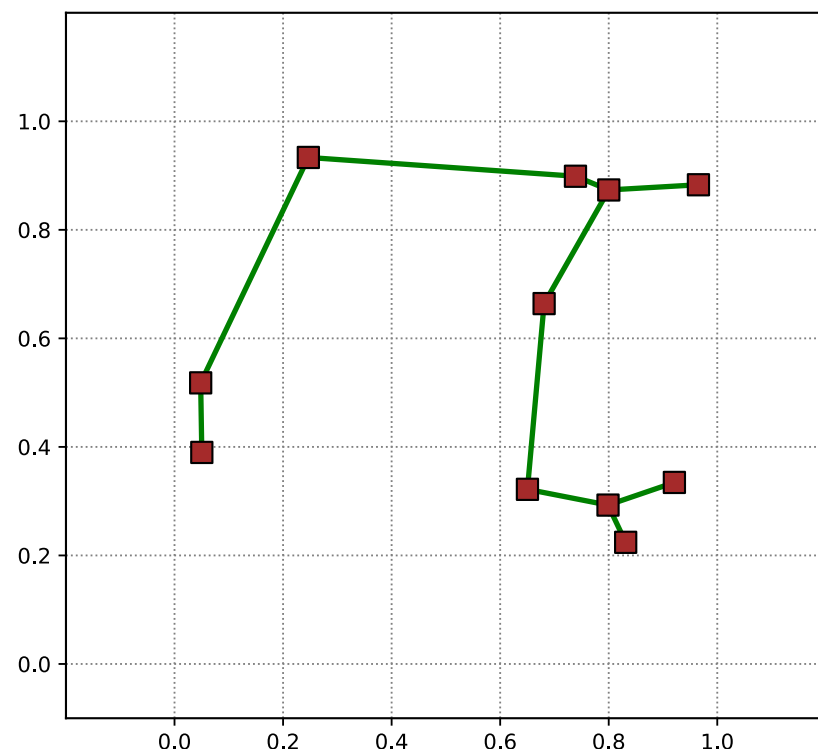
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