

# Integrated Optimal pricing, sizing and location of electric vehicle charging stations

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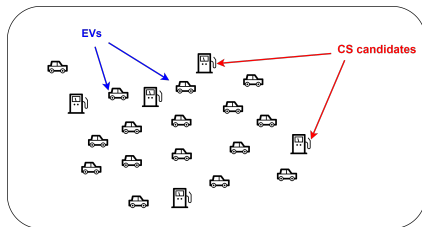
# Problem description

## Goal:

Determine the optimal pricing, sizing and locations of EVCS in order to maximize the revenue and smooth demand over time.

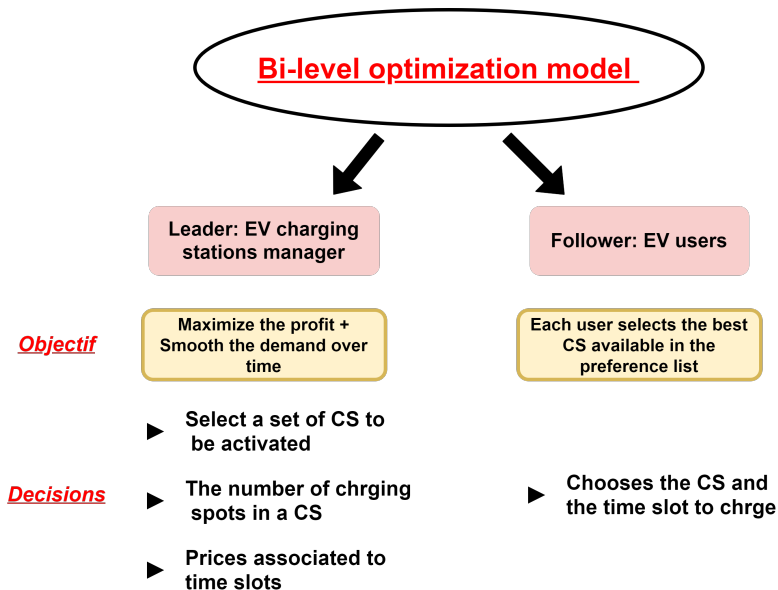
## Context:

- Strategic planning.
- Each EV user has a **preference list** (Limited size) of charging stations based on: **Expected price and/or Distance**



- Hierarchical decision making process.
- Energy prices are associated to time slots.
- Threshold price and distance for each users.
- Limited budget.

# Bi-level optimization model



## - **Solution methods:**

- Single level reformulation of the bilevel model:

Using KKT optimality conditions  $\implies$  Solve with ILP solver

- Cutting plane algorithm:

Cut infeasible solutions iteratively with valid inequalities.

## - **Preliminary numerical results on randomly generated instances:**

# Example: 10 users, 5 stations, 3 time slots

## Solution when the preference list is defined based on minimum distance

User = 1	User = 6
[2, 5, 4]	[4, 5, 2]
[1, 1, 3]	[1, 3, 2]
[5, 5, 5]	[4, 5, 4]

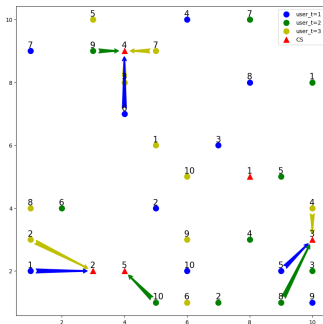
User = 2	User = 7
[2, 5, 2]	[4, 4, 4]
[5, 1, 1]	[5, 1, 2]
[4, 3, 3]	[5, 5, 3]

User = 3	User = 8
[4, 3, 1]	[3, 2, 1]
[3, 2, 1]	[2, 3, 1]
[5, 5, 4]	[5, 3, 4]

User = 4	User = 9
[3, 3, 1]	[4, 3, 5]
[3, 2, 2]	[2, 1, 3]
[4, 4, 4]	[3, 4, 3]

User = 5	User = 10
[1, 4, 3]	[5, 5, 1]
[2, 3, 1]	[2, 1, 3]
[7, 3, 7]	[7, 3, 7]

Initial  
Preference list



Revenue  
35

User obj value  
12

Sizes

$y_2=1$   
 $y_3=1$   
 $y_4=1$   
 $y_5=1$

Prices

$p_{2\_1}=5$   
 $p_{2\_3}=4$   
 $p_{3\_1}=7$   
 $p_{3\_2}=5$   
 $p_{3\_3}=4$   
 $p_{4\_1}=4$   
 $p_{4\_2}=3$   
 $p_{4\_3}=5$   
 $p_{5\_2}=7$

User = 1	User = 6
[2, 5, 4]	[4, 5, 2]
[1, 1, 3]	[1, 3, 2]
[5, 5, 5]	[4, 5, 4]

User = 2	User = 7
[2, 5, 0]	[4, 4, 4]
[3, 1, 0]	[5, 1, 2]
[4, 3, 0]	[5, 5, 3]

User = 3	User = 8
[4, 3, 0]	[3, 0, 0]
[3, 2, 0]	[2, 0, 0]
[5, 5, 0]	[5, 0, 0]

User = 4	User = 9
[3, 0, 0]	[4, 0, 5]
[3, 0, 0]	[2, 0, 3]
[4, 0, 0]	[3, 0, 3]

User = 5	User = 10
[0, 0, 3]	[5, 5, 0]
[0, 0, 1]	[2, 1, 0]
[0, 0, 7]	[7, 3, 0]

User = 1	User = 6
[2, 5, 4]	[4, 5, 2]
[1, 1, 3]	[1, 3, 2]
[5, 5, 5]	[4, 5, 4]

User = 2	User = 7
[2, 5, 0]	[4, 4, 4]
[3, 1, 0]	[5, 1, 2]
[4, 3, 0]	[5, 5, 3]

User = 3	User = 8
[4, 3, 0]	[3, 0, 0]
[3, 2, 0]	[2, 0, 0]
[5, 5, 0]	[5, 0, 0]

User = 4	User = 9
[3, 0, 0]	[4, 0, 5]
[3, 0, 0]	[2, 0, 3]
[4, 0, 0]	[3, 0, 3]

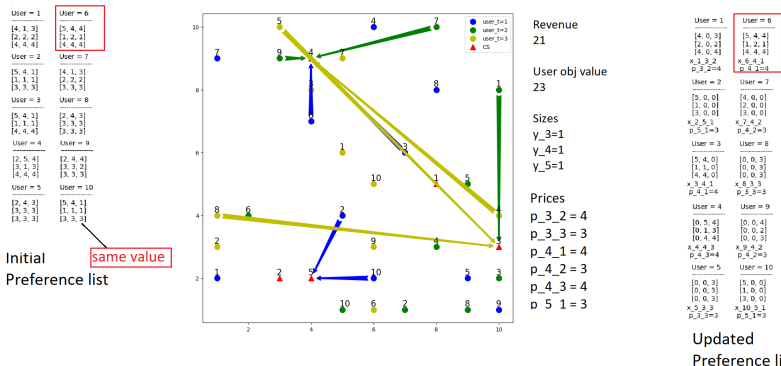
User = 5	User = 10
[0, 0, 3]	[5, 5, 0]
[0, 0, 1]	[2, 1, 0]
[0, 0, 7]	[7, 3, 0]

Updated  
Preference list

All users got their first choice except user 5, because its first choice CS-1 was not activated and the price of its second choice was  $p_{4\_3} = 7$  higher than its price threshold 3.

Example: 10 users, 5 stations, 3 time slots

### Solution when the preference list is defined based on minimum cost



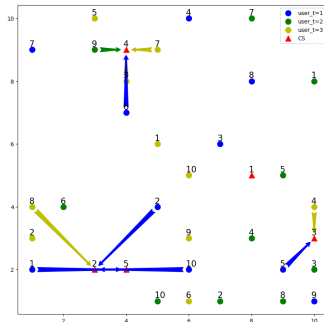
- \* Notice the longer arrows (distance).
- \* User 6 got its third choice, because its first choice CS-5 and third choice CS-4 were fully occupied.
- \* The other users can be explained in a similar way.

# Example: 10 users, 5 stations, 3 time slots

Solution when the preference list is defined based on combination of minimum cost and distances

User = 1	User = 6
[2, 1, 5]	[4, 2, 5]
[1, 2, 1]	[1, 2, 2]
[5, 4, 5]	[4, 4, 4]
User = 2	User = 7
[5, 2, 1]	[4, 4, 4]
[1, 1, 1]	[3, 2, 1]
[3, 3, 3]	[5, 3, 5]
User = 3	User = 8
[1, 4, 3]	[2, 5, 1]
[1, 3, 2]	[3, 3, 1]
[4, 5, 5]	[3, 3, 4]
User = 4	User = 9
[3, 3, 1]	[4, 5, 1]
[3, 2, 2]	[2, 3, 3]
[4, 4, 4]	[3, 3, 3]
User = 5	User = 10
[4, 1, 3]	[5, 2, 1]
[3, 2, 1]	[1, 1, 1]
[3, 7, 7]	[3, 3, 3]

Initial  
Preference list



Revenue

28

User obj value

17

Sizes

y<sub>2</sub>=1

y<sub>3</sub>=1

y<sub>4</sub>=1

y<sub>5</sub>=1

Prices

p<sub>2\_1</sub>=3

p<sub>2\_3</sub>=3

p<sub>3\_1</sub>=7

p<sub>3\_3</sub>=4

p<sub>4\_1</sub>=4

p<sub>4\_2</sub>=3

p<sub>4\_3</sub>=5

p<sub>5\_1</sub>=5

User = 1	User = 6
[2, 0, 5]	[4, 2, 5]
[1, 0, 1]	[1, 2, 2]
[5, 0, 5]	[4, 4, 4]
x <sub>1_5</sub> =1	x <sub>6_4</sub> =1
p <sub>3_1</sub> =5	p <sub>4_1</sub> =7
User = 2	User = 7
[0, 2, 0]	[4, 4, 4]
[0, 1, 0]	[3, 2, 1]
[0, 3, 0]	[5, 3, 5]
x <sub>2_2</sub> =3	x <sub>7_4</sub> =3
p <sub>2_1</sub> =3	p <sub>4_3</sub> =5
User = 3	User = 8
[0, 4, 3]	[2, 5, 0]
[0, 3, 2]	[3, 3, 0]
[0, 5, 5]	[3, 3, 0]
x <sub>3_4</sub> =3	x <sub>8_2</sub> =3
p <sub>4_3</sub> =5	p <sub>2_3</sub> =3
User = 4	User = 9
[3, 3, 0]	[4, 5, 0]
[3, 2, 0]	[2, 3, 0]
[4, 4, 0]	[3, 3, 0]
x <sub>4_3</sub> =3	x <sub>9_4</sub> =2
p <sub>3_3</sub> =4	p <sub>4_2</sub> =3
User = 5	User = 10
[0, 0, 3]	[0, 2, 0]
[0, 0, 1]	[0, 1, 0]
[0, 0, 7]	[0, 3, 0]
x <sub>5_3</sub> =1	x <sub>10_2</sub> =1
p <sub>3_1</sub> =7	p <sub>2_1</sub> =3

Updated  
Preference list

Shoter arrows (distances) than the previous.  
All users got their first available CS choice.

Thanks for your attention!