



# Introduction

- **$p$ -center problem**: Open  $p$  facilities such that the maximum distance between any customer and its nearest open facility is minimized
- Related to the set cover problem and the assignment problem
- Nesting: Open additional facilities subsequently
- **Nested  $p$ -center problem**: Open  $p_h$  facilities in period  $h$  such that the sum of the maximum distances between any customer and its nearest open facility in period  $h$  is minimized.
- Use case: Ambulance/logistics stations, network design, screening/vaccination stations
- Optimizes expansion or retraction path

# Research question

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- Which algorithms perform best in terms of solution time?
- How can the nested  $p$ -center problem affect managerial decisions?



# Definition of the nested $p$ -center problem

## Definition:

- given a set of customer demand points  $\mathcal{I}$ , potential facility locations  $\mathcal{J}$ , time periods  $\mathcal{H} = \{1, \dots, H\}$ , integers  $\mathcal{P} = \{p^1, \dots, p^H\}$  where  $p^h \leq p^{h+1}$  for  $h = 1, \dots, H-1$  and distances  $d_{ij} \geq 0$  between each  $i \in \mathcal{I}$  and  $j \in \mathcal{J}$

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- open  $p^h$ -facilities at different locations  $j \in \mathcal{J}$
- the sum of maximum distance of any customer demand  $i$  point to its closest opened facility in time period  $h$  is minimized
- and facilities open in period  $h$  has to be open in period  $h+1$  as well for  $h = 1, \dots, H-1$



## $p$ -center problem / TODO

- First introduction of the  $p$ -center problem by Hakimi (1964)
- The standard textbook formulation of the  $p$ -center problem can be found in Daskin (2013)
- Solution approach based on the set cover problem by Contardo, Iori, and Kramer (2018)
- A compact formulation by Ales and Elloumi (2018) and Elloumi, Labbé, and Pochet (2004)
- A fast projection-based branch-and-cut algorithm by Gaar and Sinnl (2022)

# Nested facility location problems

- First introduction of the nesting property and constraint by Roodman and Schwarz (1975)
- Extension of the nesting to a phase-in and phase-out by Roodman and Schwarz (1977)
- Reintroduction of the nesting on the example of the  $p$ -median problem by McGarvey and Thorsen (2022)
- Recent work on multi-period facility locations problems mainly focus on varying demand, distances, or cost over time f.e. Calogiuri et al. (2021)



## First MILP formulation

$\mathcal{I}$  ... set of customer demand points  $i$

$\mathcal{J}$  ... set of potential facility locations  $j$

$\mathcal{H}$  ... set of time periods,  $\mathcal{H} = \{1, 2, \dots, H\}$

$\mathcal{P}$  ... set of integers of facilities to open,  $\mathcal{P} = \{p^1, \dots, p^H\}$  where  $p^h > p^{h+1}$   
for  $h = 1, \dots, H-1$

$d_{ij}$  = distance between customer demand point  $i$  and potential facility location  $j$

$x_{ij}^h = \begin{cases} 1 & \dots \text{ if customer demand point } i \text{ is assigned to facility location } j \text{ in period } h \\ 0 & \dots \text{ otherwise} \end{cases}$

$y_j^h = \begin{cases} 1 & \dots \text{ if a facility is opened at location } j \text{ in period } h \\ 0 & \dots \text{ otherwise} \end{cases}$

$z^h$  ... maximum distance between any customer  $i$  and its nearest open facility  
in period  $h$

# First MILP formulation

$$(nPC1) \quad \min \sum_{h \in \mathcal{H}} z^h \quad (1a)$$

$$\text{s.t.} \quad \sum_{j \in \mathcal{J}} y_j^h = p_h \quad \forall h \in \mathcal{H} \quad (1b)$$

$$\sum_{j \in \mathcal{J}} x_{ij}^h = 1 \quad \forall i \in \mathcal{I}, h \in \mathcal{H} \quad (1c)$$

$$x_{ij}^h \leq y_j^h \quad \forall i \in \mathcal{I}, j \in \mathcal{J}, h \in \mathcal{H} \quad (1d)$$

$$\sum_{j \in \mathcal{J}} d_{ij} x_{ij}^h \leq z_h \quad \forall i \in \mathcal{I}, h \in \mathcal{H} \quad (1e)$$

$$y_j^h \geq y_j^{h-1} \quad \forall h \in \mathcal{H} \setminus \{1\} \quad (1f)$$

$$x_{ij}^h, y_j^h \in \{0, 1\} \quad \forall i \in \mathcal{I}, j \in \mathcal{J}, h \in \mathcal{H} \quad (1g)$$

$$y_j^h \in \{0, 1\} \quad \forall j \in \mathcal{J}, h \in \mathcal{H} \quad (1h)$$

$$z^h \in \mathbb{R}_{>0} \quad \forall h \in \mathcal{H} \quad (1i)$$



## Second MILP formulation

- $\mathcal{I} \dots$  set of customer demand points  $i$
- $\mathcal{J} \dots$  set of potential facility locations  $j$
- $\mathcal{H} \dots$  set of time periods,  $\mathcal{H} = \{1, 2, \dots, H\}$
- $\mathcal{P} \dots$  set of integers of facilities to open,  $\mathcal{P} = \{p^1, \dots, p^H\}$  where  $p^h > p^{h+1}$   
for  $h = 1, \dots, H-1$
- $d_{ij} =$  distance between customer demand point  $i$  and potential facility location  $j$
- $y_j^h = \begin{cases} 1 & \dots \text{ if a facility is opened at location } j \text{ in period } h \\ 0 & \dots \text{ otherwise} \end{cases}$
- $z^h \dots$  maximum distance between any customer  $i$  and its nearest open facility  
in period  $h$

## Second MILP formulation

$$(nPC2) \quad \min \quad \sum_{h \in \mathcal{H}} z^h \quad (2a)$$

$$\text{s.t.} \quad \sum_{j \in \mathcal{J}} y_j^h = p^h \quad \forall h \in \mathcal{H} \quad (2b)$$

$$z^h \geq d_{ij} - \sum_{j': d_{ij'} < d_{ij}} (d_{ij} - d_{ij'}) y_{j'}^h \quad \forall i \in \mathcal{I}, j \in \mathcal{J}, h \in \mathcal{H} \quad (2c)$$

$$y_j^h \geq y_j^{h-1} \quad \forall j \in \mathcal{J}, h \in \mathcal{H} \setminus \{1\} \quad (2d)$$

$$y_j^h \in \{0, 1\} \quad \forall j \in \mathcal{J}, h \in \mathcal{H} \quad (2e)$$

$$z^h \in \mathbb{R}_{\geq 0} \quad \forall h \in \mathcal{H} \quad (2f)$$

# Constraint lifting

Theorem [Brandstetter(2023)]

Let  $LB_h$  being a lower bound on the decision variable  $z_h$  of (nPC1) for every  $i \in I, j \in J, h \in H$  then

$$\sum_{j \in J} \max\{LB_h, d_{ij}\} x_{ijh} \leq z_h \quad \forall i \in I, h \in H \quad (\text{lift})$$

is a valid equality. Theorem is based on Gaar and Sinnl (2022).

- also valid for the y-formulation
- using various techniques to obtain  $LB_h$

## Third MILP formulation

- $\mathcal{I} \dots$  set of customer demand points  $i$ ,  $\mathcal{J} \dots$  set of potential facility locations  $j$
- $\mathcal{H} \dots$  set of time periods,  $\mathcal{H} = \{1, 2, \dots, H\}$
- $\mathcal{P} \dots$  set of integers of facilities to open,  $\mathcal{P} = \{p^1, \dots, p^H\}$  where  $p^h > p^{h+1}$  for  $h = 1, \dots, H-1$
- $\mathcal{D} \dots$  set of distinct distances where  $D_1 \leq \dots \leq D_K$  are the values in  $\mathcal{D}$
- $\mathcal{K} \dots$  set of indices in  $\mathcal{D}$
- $S_i \dots$  set of indices  $k \in \mathcal{K}$  for which there exists a facility  $j \in \mathcal{J}$  with  $d_{ij} = D_k$
- $y_j^h = \begin{cases} 1 & \dots \text{ if a facility is opened at location } j \text{ in period } h \\ 0 & \dots \text{ otherwise} \end{cases}$
- $u_k^h = \begin{cases} 1 & \dots \text{ if objective function value in time period } h \text{ is less or equal than } D_k \\ 0 & \dots \text{ otherwise} \end{cases}$
- $z^h \dots$  maximum distance between any customer  $i$  and its nearest open facility

## Third formulation

$$(nPC3) \quad \min \quad \sum_{h \in \mathcal{H}} z^h \quad (3a)$$

$$\text{s.t.} \quad \sum_{j \in \mathcal{J}} y_j^h = p^h \quad \forall h \in \mathcal{H} \quad (3b)$$

$$D_0 + \sum_{k=1}^K (D_k - D_{k-1}) u_k^h \leq z^h \quad \forall h \in \mathcal{H} \quad (3c)$$

$$u_k^h + \sum_{j: d_{ij} < D_k} y_j^h \geq 1 \quad \forall i \in \mathcal{I}, \forall h \in \mathcal{H}, \forall k \in \mathcal{S}_i \cup \{K\} \quad (3d)$$

$$u_k^h \geq u_{k+1}^h \quad \forall h \in \mathcal{H}, \forall k \in \mathcal{K} \setminus \{K\} \quad (3e)$$

$$y_j^h \leq y_j^{h-1} \quad \forall h \in \mathcal{H}, \forall j \in \mathcal{J} \quad (3f)$$

$$y_j^h \in \{0, 1\} \quad \forall h \in \mathcal{H}, \forall j \in \mathcal{J} \quad (3g)$$

$$u_k^h \in \{0, 1\} \quad \forall h \in \mathcal{H}, \forall k \in \mathcal{K} \quad (3h)$$

$$z^h \in \mathbb{R} \quad \forall h \in \mathcal{H} \quad (3i)$$

# Initial bounds

- Every optimal solution to the  $p$ -center problem is a lower bound to the respective  $z^h$
- We can use this by calculating the solution to the  $p$ -center problem for all  $p \in \mathcal{P}$
- and using the optimal values as lower bounds for the  $z^h$ .
- Every optimal solution to the  $p$ -center problem is a upper bound to the  $p + 1$ -center problem

## Upper bound third formulation

- The third formulation performance is very dependent on the size of  $\mathcal{D}$
- The lower bounds obtained through the  $p$ -center solutions can be used to to reduce the size of  $\mathcal{D}$
- Furthermore, we can reduce the size of  $\mathcal{D}$  by obtaining a upper bound on the  $z^h$
- We get this upper bound by finding a feasible solution to the nested  $p$ -center problem, subtracting  $\sum_{h=2}^H z^h$
- This works because we know that the optimal solution cannot be larger than any feasible solution we found
- and we know that the  $z^h$  cannot be smaller than  $\bar{z}^h$ . So we assume that all but  $z^1$  are optimal.
- This can be applied every time a new best feasible solution is found.

# Lifting for the first and second formulation





# Data

- data set **PMED** from "A note on solving large  $p$ -median problems" by Beasley (1985)
  - set of 40 test instances
  - the sets contain between 100 and 900 nodes

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- data set **PMED** from "A note on solving large  $p$ -median problems" by Beasley (1985)
  - set of 40 test instances
  - the sets contain between 100 and 900 nodes
- data set **TSPLIB** 2D-Euclidean distances from "TSPLIB—A Traveling Salesman Problem Library" by Reinelt (1991)
  - set of 80 instances
  - the sets contain between 51 and 18512 nodes
  - rounded to the nearest integer value

# Comparison

- comparing the results between (nPC1) and (nPC2) and (nPC3)

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- comparing the results between (nPC1) and (nPC2) and (nPC3)
- comparing the different lifting methods
- analysing the solutions of the nested and comparing it to the standard  $p$ -center problem
- analysing the results regarding managerial insights





## Further research topics

- $u$ -space model introduced by Elloumi, Labbé, and Pochet (2004)
- maximal regret as objective function
- trying to improve the performance of the nested  $p$ -median problem?

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