

# Combinatorial Optimization Research

Applications in Industry and  
Transportation  
André Amaral

# Overview of problems discussed

- Double-Row Layout Problem (DRLP)
- Transportation of Wheelchair Users
- Nesting Problem in Ship Cargo Optimization
- Aircraft Refueling Problem at Airports

# Double-Row Layout Problem (DRLP)

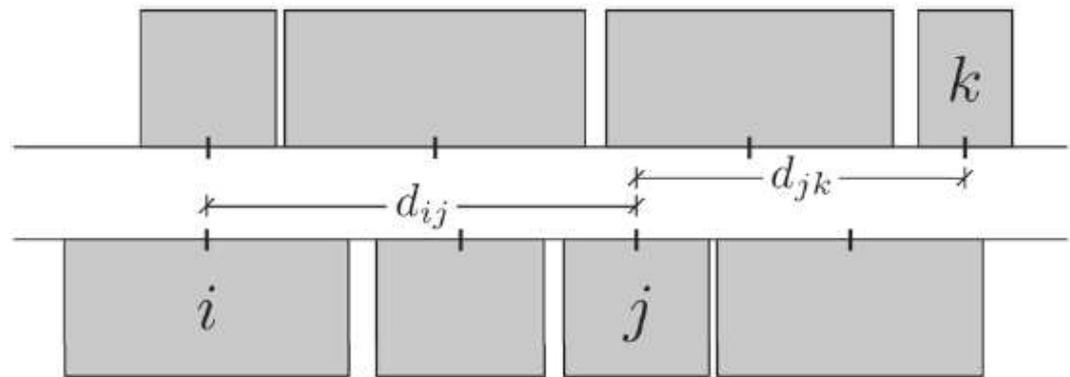
- Arranging machines along rows in factories

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$n$	Number of machines
$N = \{1, \dots, n\}$	Set of machines
$R = \{\text{upper row, lower row}\}$	Set of rows that define a corridor
$c_{ij}$	Amount of flow between machines $i$ e $j$ ( $1 \leq i < j \leq n$ )
$\ell_i$	Length of machine $i$
$L = \sum_{i=1}^n \ell_i$	

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**Fig. 1** A double row layout.  
The distance  $d_{ij}$  between two machines  $i$  and  $j$  is the horizontal distance between their centers



# DRLP

- **Objective:** Minimize material handling costs
- **Solution Methods:** Heuristics, mathematical models

A mathematical formulation for the DRLP is given by:

$$\min_{\varphi \in \Phi_n} \sum_{1 \leq i < j \leq n} c_{ij} d_{ij}^{\varphi} \quad (1)$$

where  $\Phi_n$  is the set of all double row layouts on the set  $N$ ; and  $d_{ij}^{\varphi}$  is the distance between machines  $i$  and  $j$  with reference to a layout  $\varphi \in \Phi_n$ .

# DRLP

A mixed-integer programming model

- Define the variables:

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$x_i$	Abscissa of the center of machine $i$ ( $1 \leq i \leq n$ )
$d_{ij}$	Distance between machines $i$ e $j$ ( $1 \leq i < j \leq n$ )
$\alpha_{ij}$	Binary variable that equals 1 if machine $i$ is on the left of machine $j$ , both on the same row; and 0 otherwise ( $1 \leq i, j \leq n, i \neq j$ )

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# DRLP

- Consider the vector:

$$\alpha = (\alpha_{ij})_{1 \leq i, j \leq n; i \neq j} \in \{0, 1\}^{n(n-1)}$$

- $\alpha$  is the incidence vector of a partition of the set of  $n$  machines into two linear orders.
- the convex hull of all  $\alpha$ -incidence vectors forms a polytope, denoted as  $P_n$ .
- Find classes of inequalities that are valid for the convex hull of points defined by  $P_n$ .

**Proposition 1** *The following inequalities are valid for  $P_n$ :*

$$-\alpha_{ij} + \alpha_{ik} + \alpha_{jk} - \alpha_{ji} + \alpha_{ki} + \alpha_{kj} \leq 1, \quad (i, j, k \in N; i < j; k \neq i, k \neq j) \quad (2)$$

$$-\alpha_{ij} + \alpha_{ik} - \alpha_{jk} + \alpha_{ji} - \alpha_{ki} + \alpha_{kj} \leq 1, \quad (i, j, k \in N; i < j; k < j; i \neq k) \quad (3)$$

**Proposition 2** *The following inequality is valid for  $P_n$ :*

$$\alpha_{ij} + \alpha_{ik} + \alpha_{jk} + \alpha_{ji} + \alpha_{ki} + \alpha_{kj} \geq 1, \quad (1 \leq i < j < k \leq n) \quad (4)$$

The following trivial inequalities are also valid for  $P_n$ :

$$0 \leq \alpha_{ij}, \alpha_{ij} \leq 1, \quad (1 \leq i, j \leq n; i \neq j) \quad (5)$$

# DRLP

In the sequel we shall consider the polytope  $Q_n (\supseteq P_n)$  defined by:

$$Q_n = \{\alpha \in R^{n(n-1)} : (2), (3), (4), \text{ and } (5)\}.$$

*Remark 1* The integral points in  $Q_n$  are precisely the  $\alpha$ -incidence vectors, which means that  $P_n \equiv \text{conv}(\alpha \in Q_n : \alpha \text{ is integral})$ .

# MIP model of the DRLP- Amaral (2013)

$$\min \sum_{(i,j); i < j} c_{ij} d_{ij} \quad (1)$$

$$d_{ij} \geq x_i - x_j, \quad i < j \quad (2)$$

$$d_{ij} \geq x_j - x_i, \quad i < j \quad (3)$$

$$d_{ij} - \alpha_{ij}(\ell_i + \ell_j)/2 - \alpha_{ji}(\ell_i + \ell_j)/2 \geq 0, \quad i < j \quad (4)$$

$$x_i + (\ell_i + \ell_j)/2 \leq x_j + L(1 - \alpha_{ij}), \quad i \neq j \quad (5)$$

$$x_p \leq x_q, \quad (p, q) = \arg \min_{i < j} c_{ij} \quad (6)$$

$$-\alpha_{ij} - \alpha_{ji} + \alpha_{ik} + \alpha_{ki} + \alpha_{jk} + \alpha_{kj} \leq 1, \quad i < j, k \neq i, k \neq j \quad (7)$$

$$-\alpha_{ij} + \alpha_{ji} + \alpha_{ik} - \alpha_{ki} - \alpha_{jk} + \alpha_{kj} \leq 1, \quad i < j, k < j, k \neq i \quad (8)$$

$$\alpha_{ij} + \alpha_{ji} + \alpha_{ik} + \alpha_{ki} + \alpha_{jk} + \alpha_{kj} \geq 1, \quad i < j < k \quad (9)$$

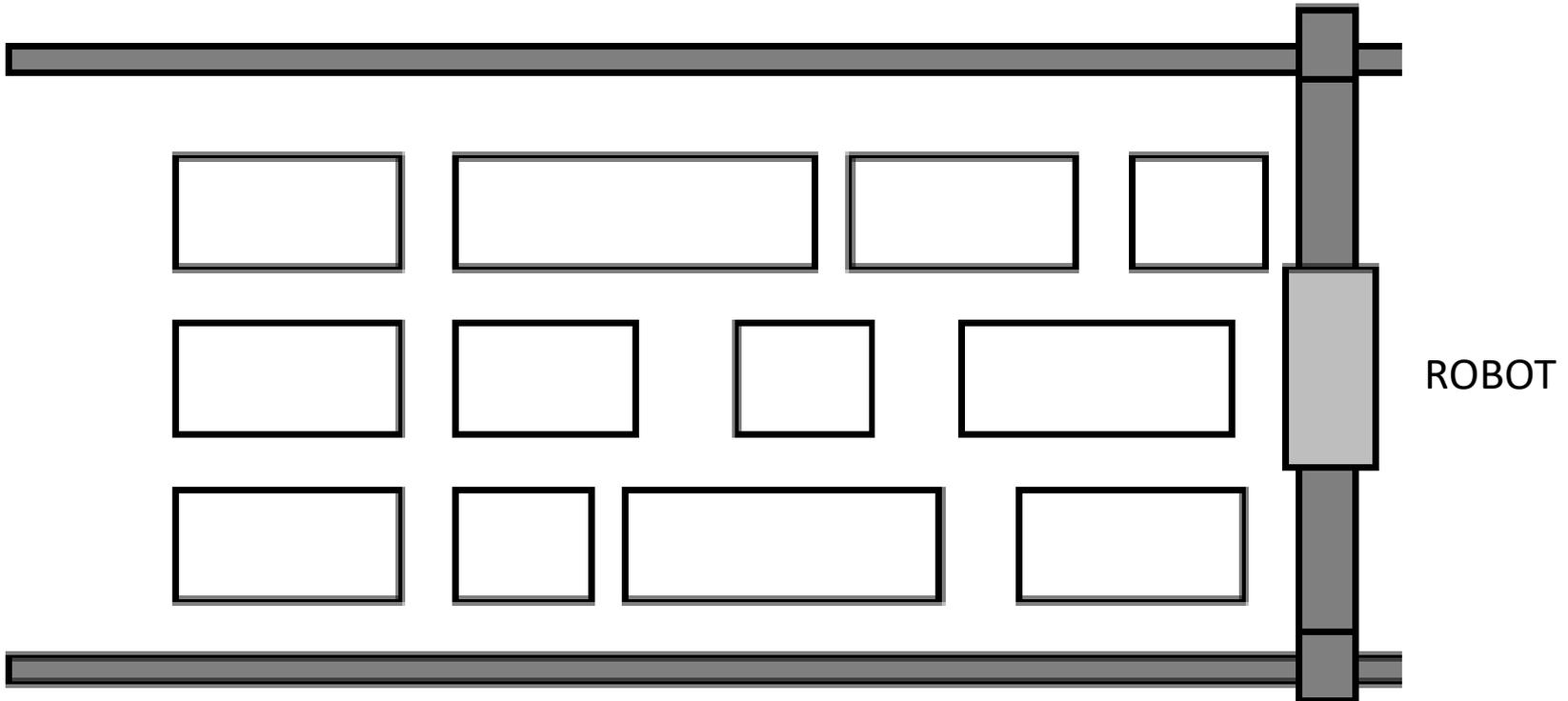
$$\alpha_{ij} \in \{0, 1\}, \quad i \neq j \quad (10)$$

$$x_i \in [\ell_i/2, L - \ell_i/2], \quad 1 \leq i \leq n \quad (11)$$

# Research Progress on the Double Row Layout Problem

- 2010: Chung and Tanchoco proposed a MIP model and obtained exact solutions for problems with  $n \leq 10$ .
- More efficient models for double row layouts were proposed by Amaral (2013) and Amaral (2018), solving problems with  $n \leq 13$ .
- Secchin and Amaral (2018) proposed a model solving problems with  $n \leq 15$ .
- Chae and Regan (2020) modified the Secchin-Amaral model and solved problems with  $n \leq 16$ .
- Amaral (2021) proposed a mathematical model solving problems with  $n \leq 16$ , more efficiently than the Chae-Regan model.
- Recently, Amaral(2024) gave a MIP that solved problems with  $n \leq 20$ .

# Future research: Multi-Row Layout Problem



# Transportation of Wheelchair Users Dial-a-Ride Problem (DARP)

- Optimizing routes for adapted buses



# Vitória-ES



# Serviço Mão-na-Roda Metropolitan Area of Vitória-Brazil



# Summary - Dial-a-Ride Problem (DARP)

- DARP is a combinatorial NP-hard problem, computationally complex to solve.
- It is a variant of the Vehicle Routing Problem (VRP), but it specifically focuses on passenger transportation.
- **INPUT:** pickup and delivery requests and a fleet of vehicles.
- **GOAL:** generate optimal routes that ensure all requests are serviced while minimizing costs.

# DARP

The key constraints include:

- **Vehicle capacity:** Each vehicle can only carry a limited number of passengers.
- **Maximum ride time:** Passengers must not spend too much time on the vehicle.
- **Time windows:** Pickup and drop-off must happen within specific time intervals.

# Additional Constraints

- The **duration of the route taken by vehicle  $k$**  must not too long.
- The **waiting time at any location** must not exceed the allowed maximum.

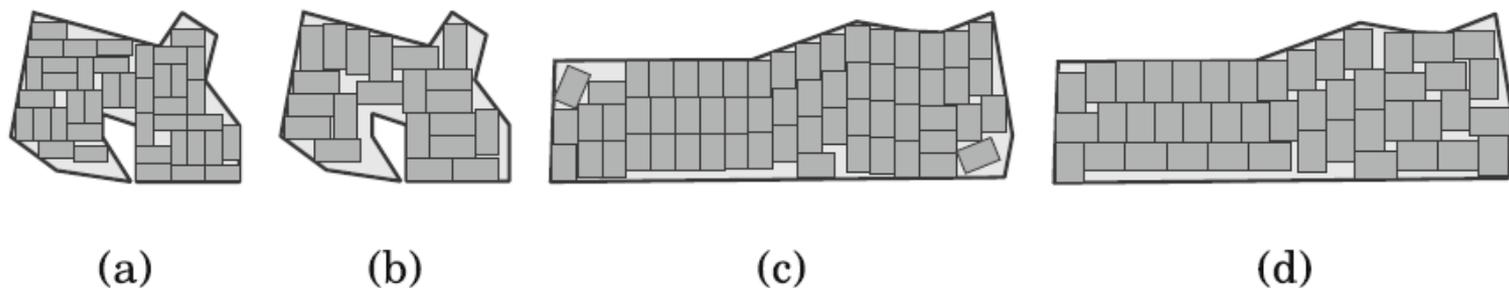


# DARP/Publication

Campos, Alba Assis ; Amaral, André Renato Sales . An Iterated Local Search for the Multi-objective Dial-a-Ride Problem. Advances in Intelligent Systems and Computing. 1ed.: Springer International Publishing, 2021, v. 1351, p. 1302-1313.

# Nesting Problem in Ship Cargo Optimization

- Fitting rectangular steel plates in ships
- **Objective:** Maximize space usage, minimize waste
- **Application:** Maritime shipping



**Fig. 6.** Best layouts found: (a) 40 items in artif-01-c; (b) 21 in artif-02-c; (c) 60 in artif-03-a; and (d) 45 in artif-04-c.

# Nesting/Publication

Romanelli, Alexandre ; Amaral, André R. S. . A Solution Approach to The Problem of Nesting Rectangles with Arbitrary Rotations into Containers of Irregular Convex and Non-Convex Shapes. In: Lalla-Ruiz E.; Mes M.; Voss S.. (Org.). Lecture Notes in Computer Science. Cham, Switzerland: Springer International Publishing, 2020, v. 12433, p. 747-762.

# Aircraft Refueling Problem

- Routing fuel trucks at airports
- **Constraints:** Truck availability, time windows
- **Application:** Smooth airport operations
- **Methods:** Metaheuristics, MIP





**Table 1.** List of parameters for each node.

<i>Par</i>	Description	<i>Par</i>	Description
$D_{i,j}$	Distance between nodes $i, j \in N$	$c_i$	Fuel quantity requested by aircraft $i$
$a_i$	Earliest moment at which refueling can start	$b_i$	Latest possible starting time for refueling
$d_i$	Distance between parked aircraft $i$ and the storage area	$q_i$	Refueling rate for aircraft $i$

**Table 2.** List of parameters for each truck  $k \in K$ .

<i>Par</i>	Description
$V_k$	Average velocity of truck $k$
$Q_k$	Maximum fuel capacity of truck $k$

# Aircraft Refueling/ Publication

- Zampirolli, Karyne Alves ; Amaral, André Renato Sales. Simulated Annealing and Iterated Local Search Approaches to the Aircraft Refueling Problem. Lecture Notes in Computer Science. 1ed. Cham: Springer International Publishing, 2021, v. 12952, p. 422-438.

# Questions and Discussion

Thank You!!