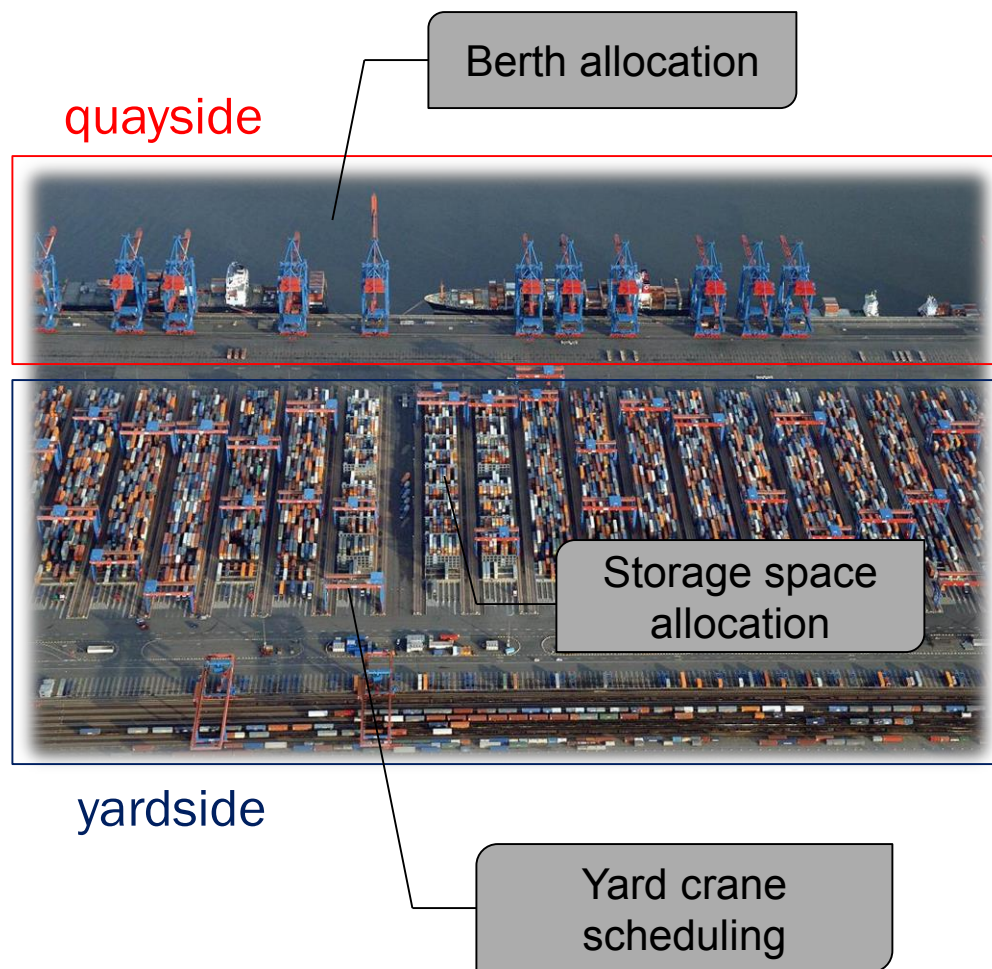


Berth Allocation Problem

- ❑ Complex system
- ❑ Making decision (Modeling)
 - Allocation
 - Assignment
 - Scheduling
- ❑ How to make the wise decisions? (Solving)
 - Deterministic or stochastic?
 - Objective(s)
 - Constraints
- ❑ Berth Allocation Problem (BAP)

Berth Allocation Problem



Berth Allocation Problem

- Definition

- ☐ Berth allocation problem aims to determine berthing time and position of each containership that will arrive at a container terminal during a planning period for optimizing an objective.

- Factors being considered

- ☐ Number of available berths
- ☐ Length, arrival time and departure time of each containership
- ☐ Locations and amount of containers for unloading and loading of each containership

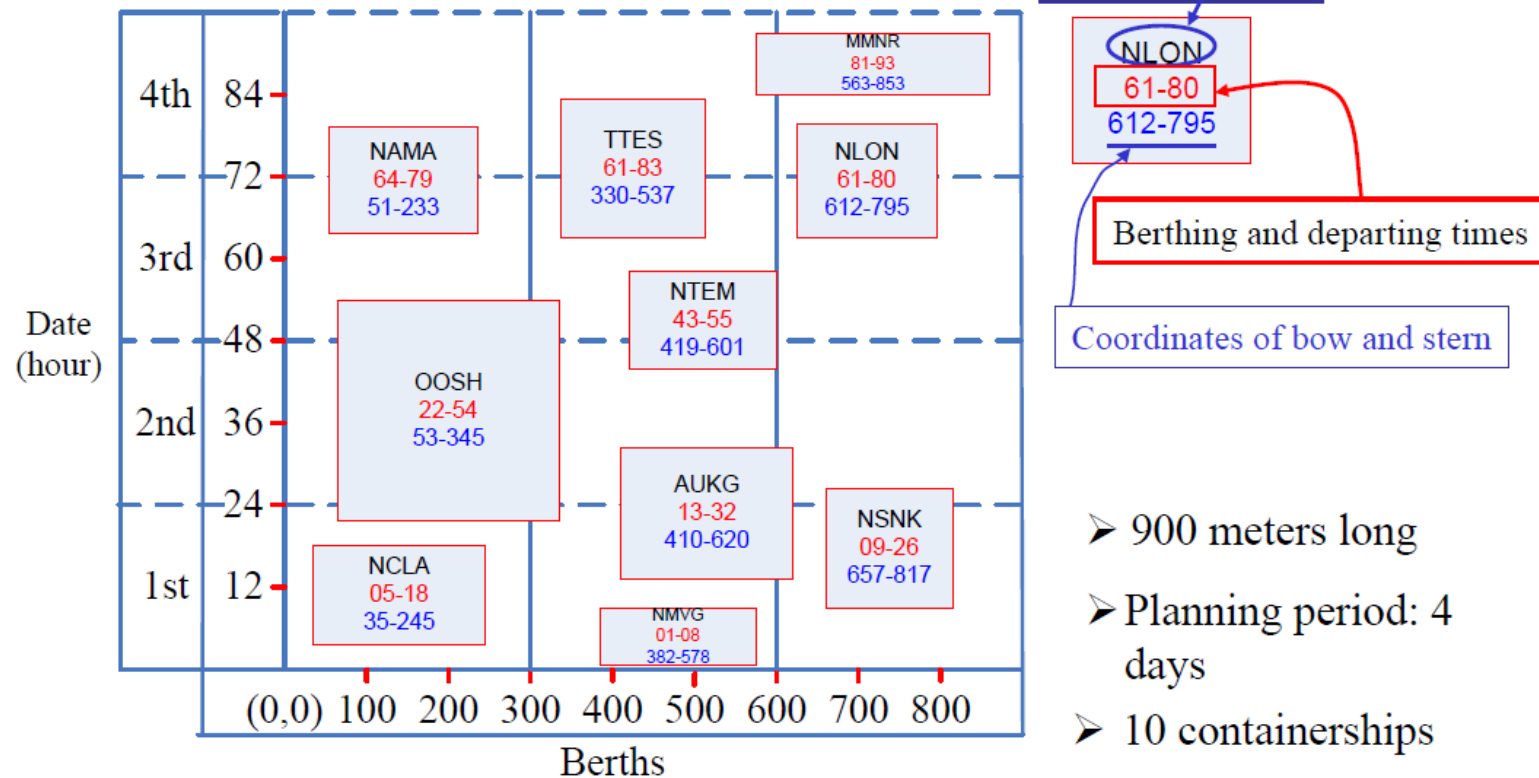
- Objectives:

- ☐ Distance: minimize shore to yard distances for all containers
- ☐ Time: minimize departure delay of all containerships

Berth Allocation Problem

- Decision: berthing position; berthing time

▪ A Feasible Berth Allocation Solution



Berth Allocation Problem

Input Parameters

Input Parameters

L : Length of total berth sections (straight line)

l : Number of vessels

p_i : Best berth location of vessel i

a_i : Expected arrival time of vessel i

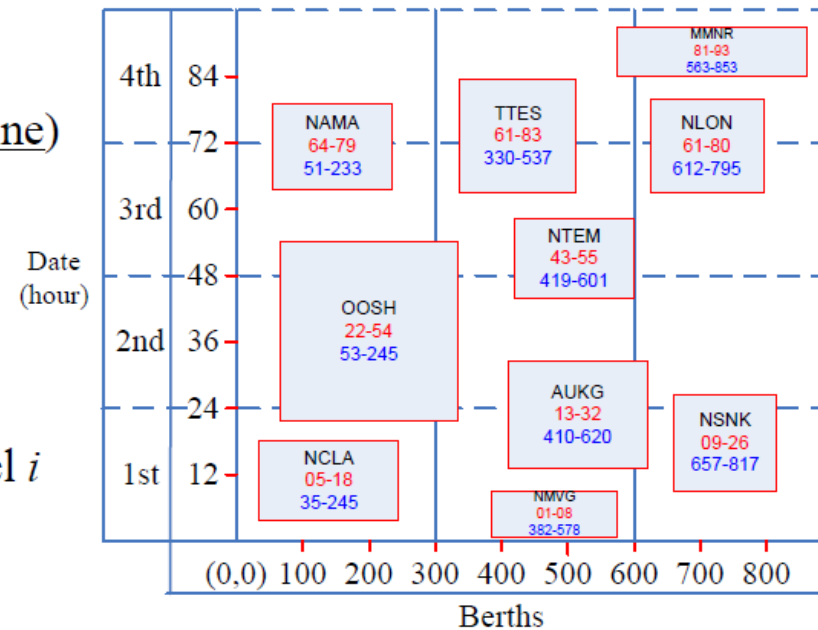
b_i : Ship operational time required for vessel i

d_i : Requested departure time of vessel i

l_i : length of vessel i

c_{1i} : Additional travel (per one grid-width) cost for delivering containers to vessel i resulting from non-optimal berthing locations.

c_{2i} : Penalty cost (per one grid-length of time) of vessel i resulting from a delayed departure past the requested due time.



Berth Allocation Problem

Decision Variables

➤ x_i : Berth location of vessel i

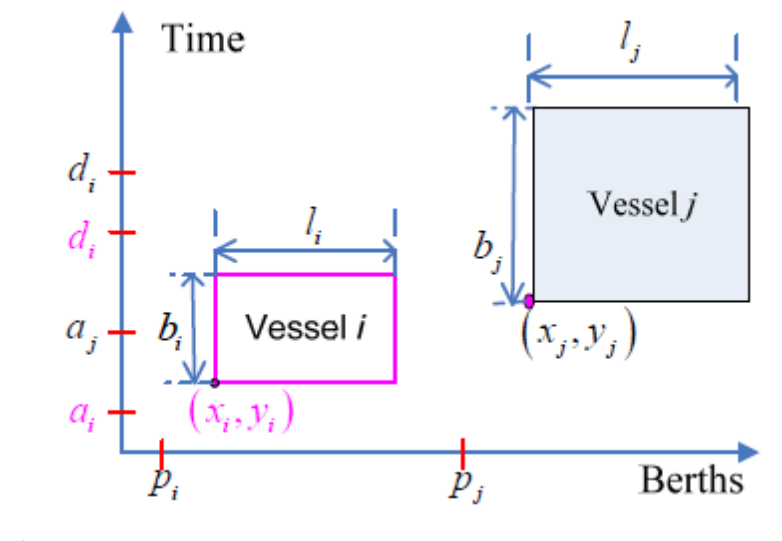
➤ y_i : Berthing time of vessel i

➤ They aim to express the position relation between any two vessels in the berth-time space:

$$z_{ij}^x = \begin{cases} 1, & \text{if vessel } i \text{ located to the left-hand side of vessel } j \\ 0, & \text{otherwise} \end{cases} \iff x_i + l_i < x_j$$

$$z_{ij}^y = \begin{cases} 1, & \text{if vessel } i \text{ located below vessel } j \\ 0, & \text{otherwise} \end{cases} \iff y_i + b_i < y_j$$

$$i=1,2,\dots,l; j=1,2,\dots,l,$$



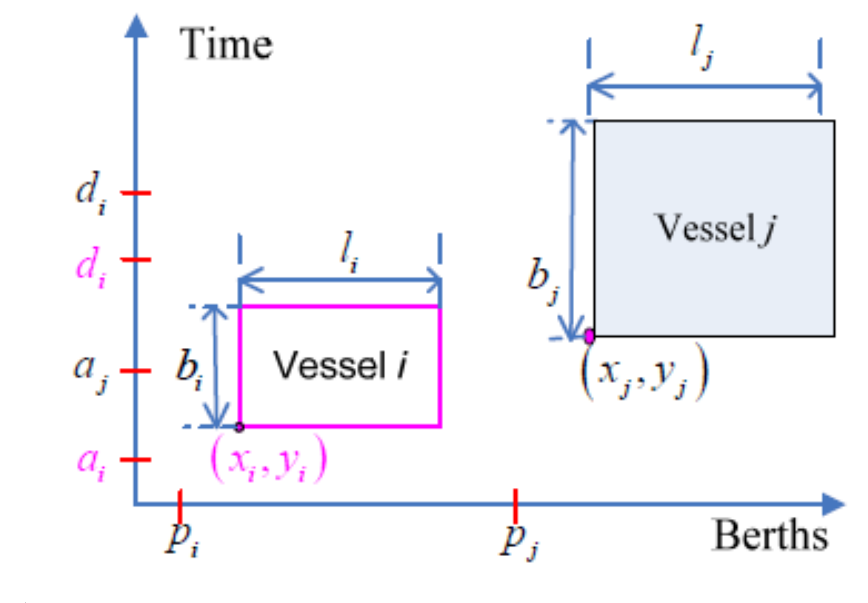
Berth Allocation Problem

- Objective function

$$\min f(x, y, z) = \sum_{i=1}^l \left\{ c_{1i} |x_i - p_i| + c_{2i} (y_i + b_i - d_i)^+ \right\}$$

Note: $[x]^+ = \max(0, x)$

- Constraints



$$x_i + l_i \leq L, i = 1, 2, \dots, l$$

The rightmost end of vessel i is restricted by the length of the total berth sections

$$x_i + l_i \leq x_j + M(1 - z_{ij}^x), i = 1, \dots, l; j = 1, \dots, l; i \neq j$$

Vessel i is located to the left-hand side of vessel j

$$y_i + b_i \leq y_j + M(1 - z_{ij}^y), i = 1, \dots, l; j = 1, \dots, l; i \neq j$$

Departure time of vessel i is not later than the berthing time of vessel j

Berth Allocation Problem

- Constraints

$$z_{ij}^x + z_{ji}^x + z_{ij}^y + z_{ji}^y \geq 1, i = 1, \dots, l; j = 1, \dots, l, i < j$$

It excludes the case: $z_{ij}^x + z_{ji}^x + z_{ij}^y + z_{ji}^y = 0$ in which case the rectangles representing schedules for vessels i and j overlap with each other

$$y_i \geq a_i, i = 1, \dots, l$$

A vessel cannot berth before it arrives

$$x_i \geq 0, i = 1, \dots, l$$

Non-negativity

$$z_{ij}^x, z_{ij}^y = 0, 1, i = 1, \dots, l; j = 1, \dots, l; i \neq j$$

0-1 constraints

Berth Allocation Problem

- Mixed Integer Nonlinear Programming Model

$$\min f(x, y, z) = \sum_{i=1}^l \left\{ c_{1i} |x_i - p_i| + c_{2i} (y_i + b_i - d_i)^+ \right\}$$

subject to

$$x_i + l_i \leq L, i = 1, 2, \dots, L$$

$$x_i + l_i \leq x_j + M(1 - z_{ij}^x), i = 1, \dots, l; j = 1, \dots, l; i \neq j$$

$$y_i + b_i \leq y_j + M(1 - z_{ij}^y), i = 1, \dots, l; j = 1, \dots, l; i \neq j$$

$$z_{ij}^x + z_{ji}^x + z_{ij}^y + z_{ji}^y \geq 1, i = 1, \dots, l; j = 1, \dots, l, i < j$$

$$y_i \geq a_i, i = 1, \dots, l$$

$$x_i \geq 0, i = 1, \dots, l$$

$$z_{ij}^x, z_{ij}^y = 0, 1, i = 1, \dots, l; j = 1, \dots, l; i \neq j$$

Berth Allocation Problem

- Homework
 - Create a test instance by randomly generating the input parameters
 - Develop a mixed integer linear programming model
 - Solve the model by PuLP/CPLEX/Gurobi
 - Present the solution and conduct analysis

Reference

- Optimization with PuLP: <https://coin-or.github.io/pulp/index.html>

- Main Topics

- The Optimisation Process
- Optimisation Concepts
- Basic Python Coding
- Installing PuLP at Home
- Amply
- README

- Case Studies

- A Blending Problem
- A Set Partitioning Problem
- A Sudoku Problem formulated as an LP
- A Transportation Problem
- A Two Stage Production Planning Problem

- User Guides

- How to configure a solver in PuLP
- How to warm-start a solver
- Elastic Constraints
- How to export models in PuLP
- How to debug most errors during solving

- PuLP Internal Documentation

- `pulp.constants`
- `pulp` : Pulp classes
- `pulp.apis` Interface to Solvers

- Plugins

- orloge: OR logs parser
- pytups: smart dictionaries and tuple lists