

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

Conflict-Free Crane Scheduling in a Seaport Terminal

Erwin Pesch

University of Siegen, Department of Management Information Science, Germany

Scheduling Seminar, 24. May 2023



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- Container Flow
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- Yard Crane Systems

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CCSP

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- Comp. Study

- 1 Problem Setting: Automated Container Terminal
 - Terminal Layouts
 - Yard Layouts
 - Container Flow
 - Yard Crane Systems
- 2 Twin Cranes
- 3 Policies and Results
- 4 Crossover Crane Scheduling Problem (CCSP)
- 5 Solution Approach: Logic-Based Benders Decomposition
- 6 Computational Results

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- Container Flow
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CCSP

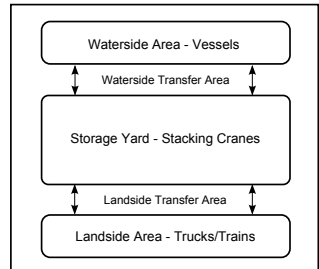
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- Subproblem
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Problem Setting

Problem Setting

Container Terminal Layouts

- **Waterside Area:** Vessels are moored at the berth and quay cranes are used to load and unload containers.
- **Landside Area:** Handles the hinterland container transportation on trucks and trains.
- **Storage Yard:** Containers are temporarily stored by yard cranes and are exchanged between the waterside and the landside.
- **Waterside Transfer Area:**



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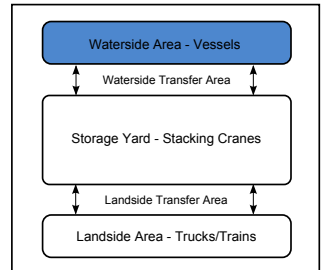
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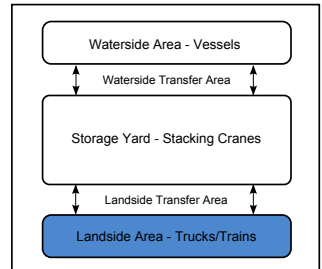


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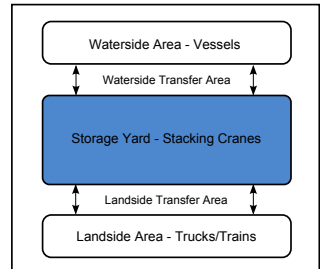


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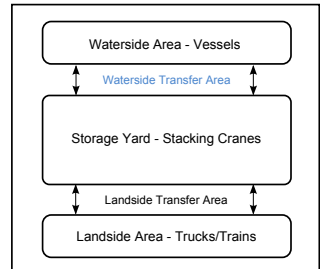


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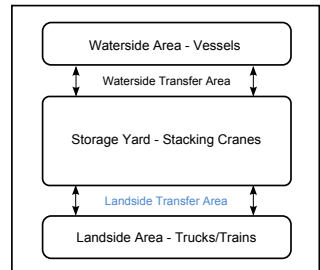


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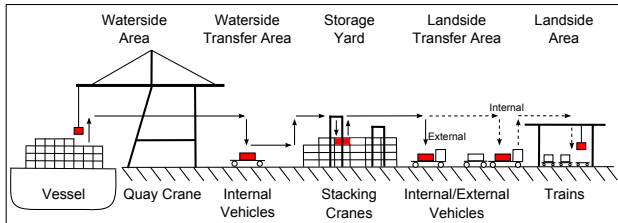
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Problem Setting

Container Flow



Container Flow (motivated by Steenken et al. 2004)

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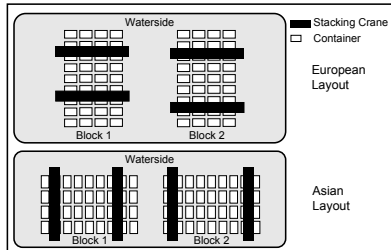
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Yard Layouts



- **European Layout:** Terminal layouts with a storage yard *perpendicular* to the waterside.
- **Asian Layout:** Terminal layouts with a storage yard *parallel* to the waterside.

Problem Setting

Yard Crane Systems

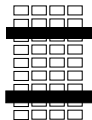
Different yard crane systems are employed at a storage yard. Systems vary, e.g., in their installation of **rail-mounted (RMG)** or **rubber-tyred (RTG)** gantry cranes.



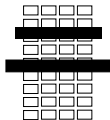
Problem Setting

Rail-Mounted Gantry Cranes

- **Twin Cranes:** Denote two RMGs of equal size which operate on the same rail tracks and cannot pass each other.
- **Crossover or Dual Cranes:** Refer to two RMGs (outer and inner crane) of different sizes that run on different tracks and have the possibility to cross each other.
- **Triple Cranes:** Consist of two twin cranes and one larger crane that moves on a different track and can pass both twin cranes.



Twin Cranes



Dual Cranes

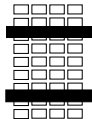


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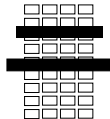
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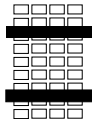


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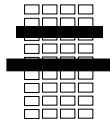
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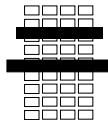
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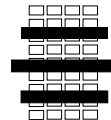
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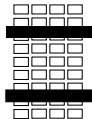


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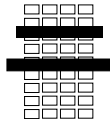
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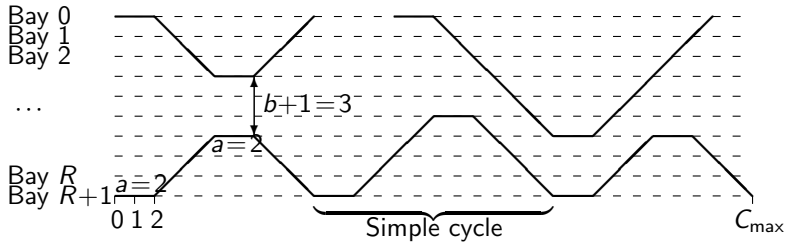
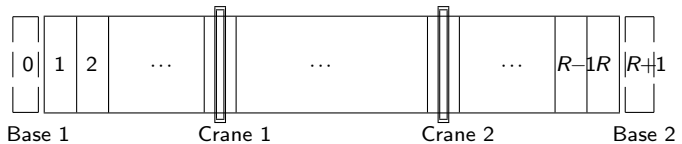
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Example of a Solution



Policies

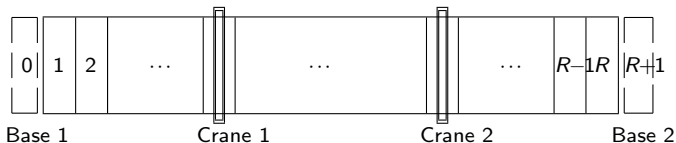


Figure: Kovalyov, Pesch, Ryzhikov, *Networks* (2018)

Containers are assigned to the cranes according to one of the following policies:

- (1) two fixed sequences policy where a container processing sequence is given for each crane, $C2|FixFix|C_{max}$
- (2) dedicated crane policy where containers are pre-assigned to the cranes, $C2|Dedic|C_{max}$
- (3) one fixed, one arbitrary sequence policy where a container processing sequence is given for one crane and it can be arbitrary for the other crane, $C2|FixAny|C_{max}$
- (4) flexible policy where any container can be assigned to any crane at any time, $C2|Flex|C_{max}$
- (5) global fixed sequence policy where the container sequence is given and the relative processing order of containers in this sequence must be preserved by any crane, $C2|GlobFix|C_{max}$

Policies

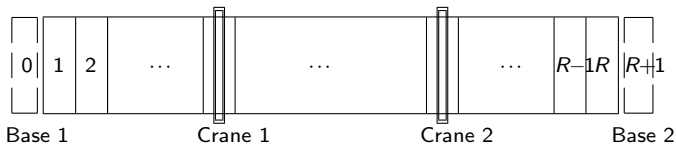


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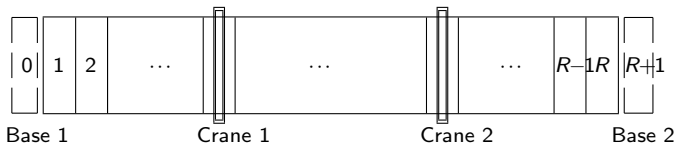


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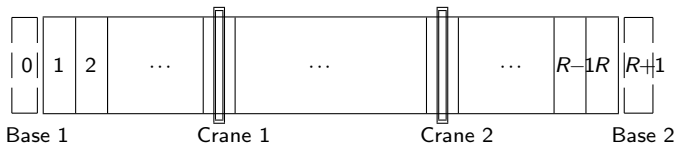


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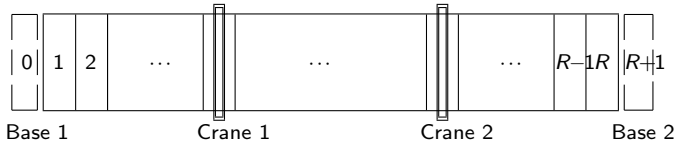


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- Problem $C2|Dedic|C_{max}$: strongly NP-hard; Erdogan et al. (2014) proved NP-hardness in the ordinary sense
- Problem $C2|FixAny|C_{max}$: NP-hard in the strong sense; Boysen, Briskorn, Emde (2015) proved for a special case $a = b = 0$, strong NP-hardness. The proof can be adjusted to show strong NP-hardness of $C2|Dedic|C_{max}$ and $C2|FixAny|C_{max}$ even if $a = 1$ and $b = 0$
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 - There exists an optimal schedule for the problem $C2|Flex|C_{max}$ and a separation number k , $1 \leq k \leq n-1$, such that containers $1, \dots, k$ are assigned to crane 1 and containers $k+1, \dots, n$ are assigned to crane 2.
 - relaxed problem $C2|Flex,meet|C_{max}$ can be solved in $O(n \log n)$ time
 - There is feasible schedule for the problem $C2|Flex|C_{max}$ with the makespan $C_{max}^I \leq C_{max}^{Flex} + (a+1)n_{max}/2$. Run time is $O(n \log n)$, is a $3/2$ -approximation algorithm for $C2|Flex|C_{max}$.
 - There is an optimal algorithm for the problem $C2|Flex|C_{max}$ if $n_{max} \leq n/2$, with a running time $O(n \log n)$.

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 - There exists an optimal schedule for the problem $C2|Flex|C_{\max}$ and a separation number k , $1 \leq k \leq n-1$, such that containers $1, \dots, k$ are assigned to crane 1 and containers $k+1, \dots, n$ are assigned to crane 2.
 - relaxed problem $C2|Flex,meet|C_{\max}$ can be solved in $O(n \log n)$ time
 - There is feasible schedule for the problem $C2|Flex|C_{\max}$ with the makespan $C_{\max}^I \leq C_{\max}^{Flex} + (a+1)n_{\max}/2$. Run time is $O(n \log n)$, is a $3/2$ -approximation algorithm for $C2|Flex|C_{\max}$.
 - There is an optimal algorithm for the problem $C2|Flex|C_{\max}$ if $n_{\max} \leq n/2$, with a running time $O(n \log n)$.

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

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Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

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Outline

Problem Setting

- Terminal Layouts
- Container Flow
- Yard Layouts
- Yard Crane Systems

Twin Cranes

- Policies
- Results

CCSP

- Solution Approach
- Master Problem
- Subproblem
- Comp. Study

- Problem $C2|GlobFix|C_{max}$
Similar algorithms guarantee an absolute deviation of $(a+1)n_{max}/2$ and a relative deviation of $3/2$ from the optimal value.

Sea Port

Outline

Problem Setting

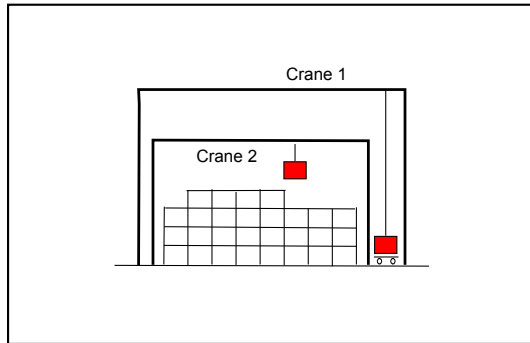
- Terminal Layouts
- Container Flow
- Yard Layouts
- Yard Crane Systems

Twin Cranes

- Policies
- Results

CCSP

- Solution Approach
- Master Problem
- Subproblem
- Comp. Study



J. Nossack, D. Briskorn, E. Pesch: Container Dispatching and Conflict-Free Yard Crane Routing in an Automated Container Terminal, *Transportation Science* 52 (2018), 1059–1076

Outline

Problem Setting

- Terminal Layouts
- Container Flow
- Yard Layouts
- Yard Crane Systems

Twin Cranes

- Policies
- Results

CCSP

- Solution Approach
- Master Problem
- Subproblem
- Comp. Study

Crossover Crane Scheduling Problem

Crossover Crane Scheduling Problem

Problem Setting: European Layout, Crossover Cranes

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

Crossover Crane Scheduling Problem

Problem Setting: European Layout, Crossover Cranes

Transportation Request

- Transportation requests arise at the water- and landside transfer area and have to be handled by the yard cranes.
- Each transportation request defines an origin and destination.
- An **inbound request** is initially located at the waterside/landside transfer area and has to be transported to a predefined yard location. This yard location is typically determined beforehand by a pre-executed stacking algorithm (cf. Dorndorf / Schneider 2010).
- An **outbound request** starts at a well-defined position in the storage yard and has to be transported to the waterside/landside transfer area.
- **Housekeeping requests** are handled inside the storage yard and improve the storage location of containers in the block (Kemme 2011).

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

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Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

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Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

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Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

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Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

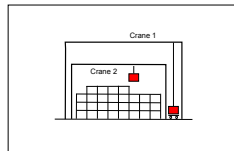
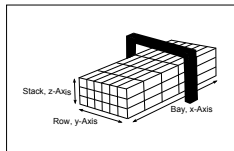
Subproblem

Comp. Study

Crossover Crane Scheduling Problem

Crane Interferences - Crossover Cranes

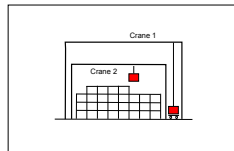
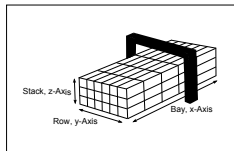
- If dual cranes are employed in a single yard block, crane interferences have to be prevented.
- Since both cranes run on different rail tracks, they can move freely from water- to landside and in the reverse direction.
- Interferences may occur if the outer crane works (i.e. picks up or delivers a container) in a certain bay and the inner crane wants to pass or work in the same bay as well.



Crossover Crane Scheduling Problem

Crane Interferences - Crossover Cranes

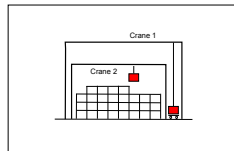
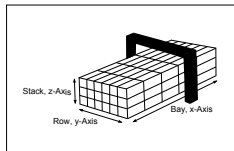
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Crossover Crane Scheduling Problem

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Crossover Crane Scheduling Problem

Outline

Problem Setting

- Terminal Layouts
- Container Flow
- Yard Layouts
- Yard Crane Systems

Twin Cranes

- Policies
- Results

CCSP

- Solution Approach
- Master Problem
- Subproblem
- Comp. Study

Crossover Crane Scheduling Problem (CCSP)

- evaluates in which order (i.e., **crane routing**) and
- by which crane (i.e., **container dispatching**) the transportation requests are carried out
- such that crane interferences (i.e., **conflict-free crane scheduling**) are prevented, and
- the **makespan** is minimized.

Crossover Crane Scheduling Problem

Outline

Problem Setting

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- Container Flow
- Yard Layouts
- Yard Crane Systems

Twin Cranes

- Policies
- Results

CCSP

- Solution Approach
- Master Problem
- Subproblem
- Comp. Study

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Theorem

The Crossover Crane Scheduling Problem is strongly NP-hard.

Proof.

Reduction to 3-PARTITION. □

Outline

Problem Setting

- Terminal Layouts
- Container Flow
- Yard Layouts
- Yard Crane Systems

Twin Cranes

- Policies
- Results

CCSP

Solution Approach

- Master Problem
- Subproblem
- Comp. Study

Solution Approach

Solution Approach: Logic-Based Benders Decomposition

Outline

Problem Setting

- Terminal Layouts
- Container Flow
- Yard Layouts
- Yard Crane Systems

Twin Cranes

- Policies
- Results

CCSP

Solution Approach

- Master Problem
- Subproblem
- Comp. Study

The CCSP simultaneously solves

- a dispatch and routing problem,
- and a conflict-free scheduling problem.

Master Problem: Dispatch and Routing Problem

The dispatch and routing problem evaluates in which order and by which crane the requests are conducted.

Subproblem: Conflict-Free Scheduling Problem

The conflict-free scheduling problem guarantees that cranes do not interfere.

Solution Approach: Logic-Based Benders Decomposition

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

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Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

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Solution Approach: Example

Example: Storage area with 8 bays, outer crane starts at bay 1, inner crane starts at bay 8

Table of Requests:

Request No.	Origin (Service Time)	Destination (Service Time)
1	3 (1)	5 (1)
2	3 (1)	5 (2)
3	4 (2)	3 (2)

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

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Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

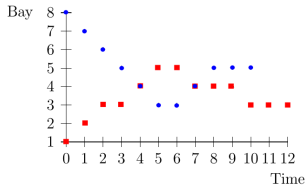
Comp. Study

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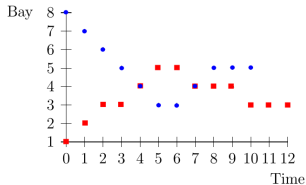


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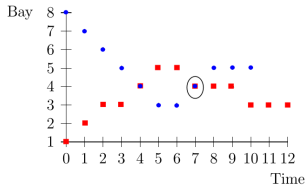
Are there any crane interferences?

Solution Approach: Example

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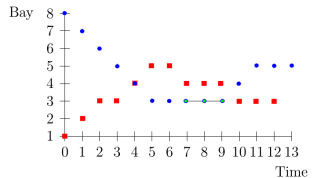
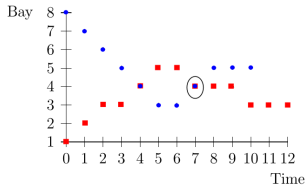
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Solution Approach: Sketch of Algorithm

Master Problem: Dispatch & Routing

$$\begin{aligned} \min W \\ \sum_{i \in R \cup \{n+1\}} y_{0,i}^k &= 1 & \forall k \in K \\ \sum_{i \in R} \sum_{j \in R \cup \{0_k\}} y_{i,j}^k &= 1 & \forall j \in R \\ \sum_{j \in R \cup \{n+1\}} y_{i,j}^k - \sum_{j \in R \cup \{0_k\}} y_{j,i}^k &= 0 & \forall i \in R; k \in K \\ \sum_{j \in R \cup \{0_k\}} y_{i,j}^k &\leq |S| - 1 & \forall S \subseteq R \cup \{0_k\}; k \in K \\ \sum_{i \in R \cup \{0_k\}} \sum_{j \in R} y_{i,j}^k \cdot (t_{i,j} + t_{i,j}^0 + s_j^0 + t_j^0) &\leq W & \forall k \in K \\ y_{i,j}^k &\in \{0, 1\} & \forall i \in R \cup \{0_k\}; j \in R \cup \{n+1\}; i \neq j; k \in K \\ W &\in \mathbb{R}_+^1 & \forall k \in K \end{aligned}$$

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

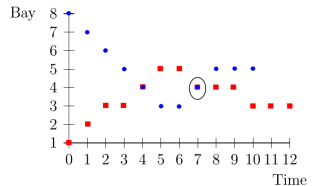
Subproblem

Comp. Study

Solution Approach: Sketch of Algorithm

Master Problem: Dispatch & Routing

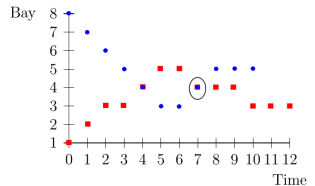
$$\begin{aligned}
 & \min W \\
 & \sum_{i \in R, j \in \{n+1\}} y_{ik,j}^k = 1 \quad \forall k \in K \\
 & \sum_{i \in R, j \in R} y_{ij}^j = 1 \quad \forall j \in R \\
 & \sum_{j \in R, i \in \{0_k\}} y_{ij}^j = 0 \quad \forall i \in R; k \in K \\
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 \end{aligned}$$



Solution Approach: Sketch of Algorithm

Master Problem: Dispatch & Routing

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Subproblem: Conflict-Free Crane Schedule

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

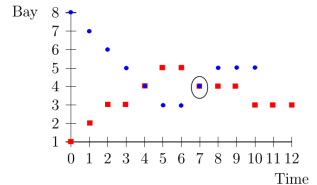
Subproblem

Comp. Study

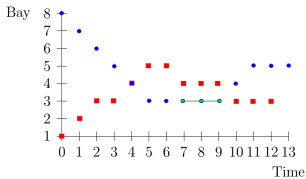
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 & W \in \mathbb{R}_+^D \quad \forall k \in K
 \end{aligned}$$



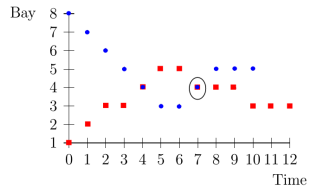
Subproblem: Conflict-Free Crane Schedule



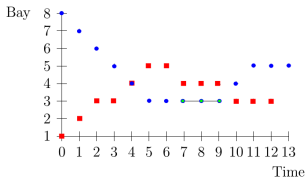
Solution Approach: Sketch of Algorithm

Master Problem: Dispatch & Routing

$$\begin{aligned}
 & \min W \\
 & \sum_{i \in R, j \in I+1} y_{ij}^k = 1 \quad \forall k \in K \\
 & \sum_{k \in K} \sum_{i \in R, j \in \{0_k\}} y_{ij}^k = 1 \quad \forall j \in R \\
 & \sum_{j \in R, i \in I+1} y_{ij}^k - \sum_{i \in R, j \in \{0_k\}} y_{ij}^k = 0 \quad \forall i \in R, k \in K \\
 & \sum_{i \in I} y_{ij}^k \leq |S| - 1 \quad \forall S \subseteq R \cup \{0_k\}, k \in K \\
 & \sum_{i \in R, j \in \{0_k\}} y_{ij}^k \cdot (t_{ij} + t_{ij} + s^D + s^D) \leq W \quad \forall k \in K \\
 & y_{ij}^k \in \{0, 1\} \quad \forall i \in R \cup \{0_k\}, j \in R \cup \{0_k\}, i \neq j, k \in K \\
 & W \in \mathbb{R}_+^D \quad \forall k \in K
 \end{aligned}$$



Subproblem: Conflict-Free Crane Schedule



Logic-Based Benders Constraints

$$\hat{W}^h (1 - \sum_{k \in K} \sum_{(i,j) \in J_k^h} (1 - y_{i,j}^k)) \leq W \quad \forall h \in H$$

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

Master Problem: Dispatch & Routing

Master Problem: Dispatch & Routing

Notation

Parameter	Parameter Description
K	cranes, $K := \{1, 2\}$ with 1 outer crane and 2 inner crane
Q	yard bays, $Q := \{1, \dots, l\}$
R	set of transportation requests, $R := \{1, \dots, n\}$
O_i	origin location of request $i \in R$, $O_i \in Q$
D_i	destination location of request $i \in R$, $D_i \in Q$
S_k	initial location of crane k , $S_k \in Q$
s_{O_i}	service time at origin O_i , $s_{O_i} \geq 0$
s_{D_i}	service time at destination D_i , $s_{D_i} \geq 0$
$t_{i,j}$	travel time from the destination D_i of request i to the origin O_j of request j , $t_{i,j} := D_i - O_j $
$t_{i,i}$	travel time from the origin O_i to the destination D_i of request i , $t_{i,i} := O_i - D_i $

Decision Variables

$$y_{ij}^k = \begin{cases} 1, & \text{if request } j \text{ is conducted after request } i \\ & \text{by crane } k \\ 0, & \text{otherwise} \end{cases}$$

$$W \in \mathbb{R}_0^+ = \text{makespan}$$

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

Master Problem: Dispatch & Routing

Master Problem: Mathematical Model

min W

$$\sum_{i \in RU\{n+1\}} y_{0_k,i}^k = 1 \quad \forall k \in K$$

$$\sum_{k \in K} \sum_{\substack{i \in RU\{0_k\} \\ i \neq j}} y_{i,j}^k = 1 \quad \forall j \in R$$

$$\sum_{\substack{j \in RU\{n+1\} \\ i \neq j}} y_{i,j}^k - \sum_{\substack{j \in RU\{0_k\} \\ i \neq j}} y_{j,i}^k = 0 \quad \forall i \in R; k \in K$$

$$\sum_{\substack{i,j \in S \\ i \neq j}} y_{i,j}^k \leq |S| - 1 \quad \forall S \subseteq RU\{0_k\}; k \in K$$

$$\sum_{\substack{i \in RU\{0_k\} \\ i \neq j}} y_{i,j}^k \cdot (t_{i,i} + t_{i,j} + s_{o_i} + s_{D_j}) \leq W \quad \forall k \in K$$

$$y_{i,j}^k \in \{0,1\} \quad \forall i \in RU\{0_k\}; j \in RU\{n+1\}; i \neq j; k \in K$$

$$W \in \mathbb{R}_0^+ \quad \forall k \in K$$

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

Outline

Problem Setting

- Terminal Layouts
- Container Flow
- Yard Layouts
- Yard Crane Systems

Twin Cranes

- Policies
- Results

CCSP

- Solution Approach
- Master Problem
- Subproblem
- Comp. Study

Subproblem: Conflict-Free Crane Scheduling

Subproblem: Conflict-Free Crane Scheduling

Outline

Problem Setting

- Terminal Layouts
- Container Flow
- Yard Layouts
- Yard Crane Systems

Twin Cranes

- Policies
- Results

CCSP

- Solution Approach
- Master Problem
- Subproblem
- Comp. Study

- Crane interferences are resolved in the subproblem.
- For a given dispatch and route, the subproblem determines a conflict-free crane schedule with minimum makespan \hat{W} .
- Briskorn / Angeloudis (2016) provide a polynomial algorithm that reduces the conflict-free crane schedule problem to a shortest path problem in specially designed acyclic arc-weighted directed graph.

Subproblem: Conflict-Free Crane Scheduling

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

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Subproblem: Conflict-Free Crane Scheduling

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

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Subproblem: Conflict-Free Crane Scheduling

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

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- For a given dispatch and route, the subproblem determines a conflict-free crane schedule with minimum makespan \hat{W} .
- Briskorn / Angeloudis (2016) provide a polynomial algorithm that reduces the conflict-free crane schedule problem to a shortest path problem in specially designed acyclic arc-weighted directed graph.

Logic-Based Benders Constraints

$$\hat{W}^h (1 - \sum_{k \in K} \sum_{(i,j) \in J_k^h} (1 - y_{ij}^k)) \leq W \quad \forall h \in H$$

Outline

Problem Setting

- Terminal Layouts
- Container Flow
- Yard Layouts
- Yard Crane Systems

Twin Cranes

- Policies
- Results

CCSP

- Solution Approach
- Master Problem
- Subproblem
- Comp. Study

Computational Study

Computational Study

System Specifications, Data Set, Implementation

- System specifications: Intel Pentium Core 2 Duo, 2.2 GHz PC, 4GB system memory
- Mathematical model: CPLEX 12.5 Concert Technology
- Data set: Instance Generator by Briskorn / Jaehn / Wiehl 2019

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

Computational Study (1 Hour)

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

# Requests = 15						# Requests = 20					
Type	LB	Obj. Val.	CPU (in sec)	#SEC	#LBC	Type	LB	Obj. Val.	CPU (in sec)	#SEC	#LBC
6/6/3	258.00	261.00	14.09	70	6	10/9/1	414.00	415.00	3600(0.24%)	5008	6543
5/7/3	240.50	243.00	28.60	146	56	9/7/4	348.00	349.00	300.45	1042	1230
4/8/3	270.50	271.00	65.54	176	41	13/6/1	377.00	379.00	3600(0.53%)	4456	5944
7/5/3	236.50	237.00	3.00	70	7	5/10/5	345.50	346.00	3600(0.14%)	242	31
7/5/3	262.50	264.00	22.42	448	112	7/10/13	349.50	350.00	142.64	84	3
7/6/2	298.50	300.00	9.26	72	29	5/11/4	337.50	338.00	431.81	142	24
4/7/4	254.50	258.00	9.52	170	29	9/8/3	354.50	355.00	5.98	110	19
3/8/4	257.00	257.00	2.98	164	31	8/8/4	384.00	387.00	3600(0.78%)	5622	4236
8/4/3	231.50	234.00	14.39	382	311	9/8/3	321.00	323.00	3600(0.62%)	2298	5104
4/8/3	263.00	263.00	6.00	156	31	6/10/4	315.50	317.00	393.15	712	1378
6/7/2	215.50	217.00	2.33	58	24	9/8/3	315.50	316.00	30.03	138	22
6/6/3	246.00	247.00	68.79	434	383	8/8/4	298.50	299.00	265.28	352	45
9/4/2	286.00	287.00	471.50	882	2594	10/8/2	355.50	356.00	113.28	186	50
6/5/4	241.00	241.00	1.41	44	6	8/9/3	328.00	328.00	2.45	158	30
6/5/4	235.50	237.00	3.93	182	46	9/10/1	379.50	380.00	327.38	200	21
5/7/3	248.00	249.00	0.42	34	4	9/10/1	378.00	379.00	3600(0.26%)	2030	9179
6/5/4	235.50	237.00	1.32	148	20	10/4/6	322.00	325.00	3600(0.92%)	3780	5098
6/6/3	260.00	260.00	3.37	236	62	9/7/4	355.00	355.00	8.49	106	22
6/6/3	282.00	283.00	297.10	308	214	9/7/4	365.00	366.00	0.27	1738	8635
7/6/2	284.50	285.00	2.88	38	4	9/8/3	298.50	299.00	5.76	100	21
3/9/3	279.50	281.00	7.46	48	1	8/10/12	365.50	367.00	3600(0.41%)	3822	2925
3/9/3	322.50	323.00	489.85	64	5	10/8/2	353.50	355.00	23.01	274	47
3/9/3	241.00	241.00	0.41	30	4	11/6/3	355.50	356.00	9.81	266	100
6/6/3	234.00	236.00	0.96	64	10	7/10/3	366.50	367.00	8.72	372	99
5/8/2	265.50	266.00	3.85	164	20	9/9/2	321.50	322.00	357.71	260	29
9/4/2	266.00	266.00	5.63	152	42	10/6/4	413.00	413.00	2.32	276	31
3/8/4	254.50	256.00	67.97	254	89	9/9/2	329.00	329.00	2.63	228	16
7/8/0	284.00	287.00	7.79	40	2	7/10/3	373.00	373.00	0.96	72	5
7/4/4	300.50	302.00	19.67	188	61	8/7/5	381.00	382.00	3600(0.26%)	3186	3611
5/7/3	247.50	248.00	1.14	34	1	4/10/6	373.50	374.00	914.51	510	106
Avg.	260.05	261.23	54.45	175.20	141.50		352.47	353.33	1191.55	1259.00	1820.13

Computational Study (10 Seconds)

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

# Requests = 30						# Requests = 40					
Type	LB	Obj. Val.	Gap (in %)	#SEC	#LBC	Type	LB	Obj. Val.	Gap (in %)	#SEC	#LBC
12/14/4	610.00	618.00	1.29	110	13	20/13/7	695.00	702.00	1.00	200	27
10/16/4	531.50	538.00	1.21	98	14	12/19/9	720.00	732.00	1.64	260	22
9/14/7	483.00	498.00	3.01	150	13	15/17/8	621.00	628.00	1.11	224	28
12/14/4	472.50	480.00	1.56	164	17	20/15/5	702.50	710.00	1.06	216	31
15/10/5	524.00	529.00	0.95	212	22	15/17/8	663.50	671.00	1.21	176	35
17/9/4	500.00	504.00	0.79	234	9	14/15/11	703.00	713.00	1.40	308	28
12/12/6	505.00	506.00	0.20	342	53	15/13/12	699.50	705.00	0.78	244	19
13/14/3	517.50	518.00	0.10	286	24	19/14/7	675.50	690.00	2.10	258	30
12/11/7	576.00	584.00	1.37	402	53	12/21/7	706.50	714.00	1.05	232	24
18/5/7	495.00	500.00	1.00	568	81	16/15/9	645.00	655.00	1.53	284	20
14/14/2	550.00	560.00	1.79	464	59	15/16/9	688.00	702.00	1.99	210	28
10/12/8	525.50	559.00	1.16	524	84	12/19/9	603.50	611.00	1.23	214	16
8/16/6	496.50	498.00	0.30	472	71	16/16/8	695.50	713.00	2.45	238	20
11/14/5	473.50	484.00	2.17	496	68	11/19/10	664.50	670.00	0.82	112	18
13/14/3	541.50	542.00	0.09	278	38	18/15/7	672.50	682.00	1.39	236	23
11/15/4	493.00	496.00	0.60	404	102	19/15/6	719.00	730.00	1.51	144	14
12/12/6	540.50	549.00	1.55	488	66	18/14/8	708.00	726.00	2.48	196	11
10/16/4	482.50	483.00	0.10	158	22	15/17/8	624.00	629.00	0.79	192	16
11/16/3	543.50	547.00	0.64	478	73	19/13/8	675.00	682.00	1.03	216	25
19/8/3	491.50	494.00	0.51	444	33	19/14/7	717.50	726.00	1.17	272	17
14/10/6	493.50	501.00	1.50	374	49	20/10/10	683.00	687.00	0.58	188	17
14/11/5	517.50	526.00	1.62	398	55	20/14/6	693.50	702.00	1.21	154	25
10/14/6	482.00	492.00	2.03	446	32	14/18/8	706.00	719.00	1.81	234	36
15/11/4	535.00	540.00	0.93	362	51	15/17/8	639.50	643.00	0.54	172	31
11/9/10	547.00	554.00	1.26	188	17	12/18/10	701.50	707.00	0.78	212	18
9/14/7	517.50	521.00	0.67	172	20	16/16/8	668.00	671.00	0.45	123	16
11/12/7	526.50	533.00	1.22	136	22	16/17/7	577.50	582.00	0.77	238	31
15/11/4	482.50	486.00	0.72	126	7	20/12/8	713.00	720.00	0.97	182	12
12/16/2	560.50	567.00	1.15	172	11	16/16/8	709.50	723.00	1.87	238	27
13/10/7	600.00	606.00	0.99	146	15	14/18/8	673.50	678.00	0.66	206	26
Avg.	520.48	527.10	1.08	309.73	39.80		678.80	687.43	1.25	212.63	23.03

Computational Study (60 Seconds)

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

# Requests = 30						# Requests = 40					
Type	LB	Obj. Val.	Gap (in %)	#SEC	#LBC	Type	LB	Obj. Val.	Gap (in %)	#SEC	#LBC
12/14/4	610.00	613.00	0.49	594	99	20/13/7	695.00	701.00	0.86	676	171
10/16/4	531.50	536.00	0.84	488	80	12/19/9	720.00	722.00	0.28	432	39
9/14/7	483.00	490.00	1.43	686	107	15/17/8	621.00	628.00	1.11	500	82
12/14/4	472.50	473.00	0.11	304	35	20/15/5	702.50	708.00	0.78	882	290
15/10/5	524.00	528.00	0.76	1842	304	15/17/8	663.50	667.00	0.52	1110	201
17/9/4	500.00	500.00	0.00	650	53	14/15/11	703.00	705.00	0.28	972	154
12/12/6	505.00	506.00	0.20	858	616	15/13/12	699.50	705.00	0.78	482	62
13/14/3	517.50	518.00	0.10	286	24	19/14/7	675.50	687.00	1.67	378	48
12/11/7	576.00	580.00	0.69	574	83	12/21/7	706.50	713.00	0.91	370	56
18/5/7	495.00	500.00	1.00	646	94	16/15/9	645.00	646.00	0.15	894	224
14/14/2	550.00	557.00	1.26	772	137	15/16/9	688.00	689.00	0.15	1022	238
10/12/8	525.50	558.00	0.99	1874	298	12/19/9	603.50	605.00	0.25	684	82
8/16/6	496.50	497.00	0.10	872	169	16/16/8	695.50	699.00	0.50	464	45
11/14/5	473.50	475.00	0.32	1042	313	11/19/10	664.50	670.00	0.82	320	47
13/14/3	541.50	542.00	0.09	278	38	18/15/7	672.50	682.00	1.39	718	106
11/15/4	493.00	496.00	0.60	472	132	19/15/6	719.00	726.00	0.96	984	260
12/12/6	540.50	546.00	1.01	844	145	18/14/8	708.00	716.00	1.12	1016	157
10/16/4	482.50	483.00	0.10	158	22	15/17/8	624.00	624.00	0.00	318	46
11/16/3	543.50	545.00	0.28	1212	235	19/13/8	675.00	682.00	1.03	472	63
19/8/3	491.50	493.00	0.30	1280	213	19/14/7	717.50	726.00	1.17	384	31
14/10/6	493.50	494.00	0.10	1138	212	20/10/10	683.00	687.00	0.58	566	89
14/11/5	517.50	519.00	0.29	1474	466	20/14/6	693.50	701.00	1.07	850	180
10/14/6	482.00	484.00	0.41	1082	81	14/18/8	706.00	714.00	1.21	1096	166
15/11/4	535.00	538.00	0.56	1220	234	15/17/8	639.50	641.00	0.23	670	140
11/9/10	547.00	550.00	0.55	770	126	12/18/10	701.50	707.00	0.78	328	28
9/14/7	517.50	519.00	0.29	442	49	16/16/8	668.00	671.00	0.45	138	17
11/12/7	526.50	527.00	0.09	292	60	16/17/7	577.50	581.00	0.60	346	47
15/11/4	482.50	483.00	0.10	190	25	20/12/8	713.00	719.00	0.83	620	70
12/16/2	560.50	561.00	0.09	796	88	16/16/8	709.50	717.00	1.05	1136	174
13/10/7	600.00	604.00	0.66	1244	288	14/18/8	673.50	678.00	0.66	986	155
Avg.	520.48	523.83	0.46	812.67	160.87		678.80	683.90	0.74	660.47	115.60

Computational Study

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

Comparison with Simulated Annealing

- Simulated Annealing (SA) by Vis / Roodbergen 2010
- SA: The basic idea is to randomly assign requests to either crane and to solve for each crane a single-crane routing problem to optimality by a solution approach presented by Vis / Roodbergen 2010.
- We implemented two variants of the SA (SA1 and SA2).

Computational Study (60 Seconds, Simulated Annealing)

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

		# Requests = 20					# Requests = 30				
Type	LB	Obj. Val. BD	Obj. Val. SA1	Obj. Val. SA2	Type	LB	Obj. Val. BD	Obj. Val. SA1	Obj. Val. SA2		
9/11	384.50	387.00 (0.65%)	388.00 (0.90%)	388.00 (0.90%)	15/15	574.00	576.00 (0.35%)	578.00 (0.69%)	579.00 (0.86%)		
11/9	358.00	358.00 (0.00%)	362.00 (1.10%)	363.00 (1.38%)	19/11	604.50	605.00 (0.08%)	606.00 (0.25%)	607.00 (0.41%)		
8/12	405.00	405.00 (0.00%)	405.00 (0.00%)	406.00 (0.25%)	13/17	506.00	509.00 (0.59%)	513.00 (1.36%)	510.00 (0.78%)		
13/7	353.50	354.00 (0.14%)	357.00 (0.98%)	356.00 (0.70%)	15/15	503.00	503.00 (0.00%)	507.00 (0.79%)	508.00 (0.98%)		
9/11	353.00	356.00 (0.84%)	358.00 (1.40%)	360.00 (1.94%)	15/15	511.00	515.00 (0.00%)	517.00 (1.16%)	517.00 (1.16%)		
10/10	452.00	452.00 (0.00%)	452.00 (0.00%)	452.00 (0.00%)	17/13	498.00	498.00 (0.00%)	501.00 (0.60%)	504.00 (1.19%)		
9/11	356.00	356.00 (0.00%)	360.00 (1.11%)	357.00 (0.28%)	18/12	551.00	551.00 (0.00%)	555.00 (0.72%)	554.00 (0.54%)		
10/10	362.50	363.00 (0.14%)	364.00 (0.41%)	363.00 (0.14%)	13/17	513.00	518.00 (0.97%)	518.00 (0.97%)	519.00 (1.16%)		
10/10	368.00	372.00 (1.08%)	374.00 (1.60%)	372.00 (1.08%)	15/15	543.50	544.00 (0.09%)	551.00 (1.36%)	546.00 (0.46%)		
10/10	360.50	362.00 (0.41%)	364.00 (0.96%)	363.00 (0.69%)	15/15	483.00	483.00 (0.00%)	488.00 (1.02%)	487.00 (0.82%)		
9/11	299.00	299.00 (0.00%)	302.00 (0.99%)	303.00 (1.32%)	15/15	583.00	587.00 (0.68%)	589.00 (1.02%)	587.00 (0.68%)		
8/12	313.50	318.00 (1.42%)	320.00 (2.03%)	318.00 (1.42%)	16/14	525.00	529.00 (0.76%)	530.00 (0.94%)	532.00 (1.32%)		
9/11	364.00	365.00 (0.27%)	367.00 (0.82%)	366.00 (0.55%)	16/14	560.50	568.00 (1.32%)	569.00 (1.49%)	569.00 (1.49%)		
11/9	352.00	353.00 (0.28%)	356.00 (1.12%)	356.00 (1.12%)	15/15	463.00	467.00 (0.86%)	469.00 (1.28%)	469.00 (1.28%)		
11/9	366.50	368.00 (0.41%)	368.00 (0.41%)	370.00 (0.95%)	13/17	556.50	564.00 (1.33%)	561.00 (0.80%)	562.00 (0.98%)		
11/9	397.50	398.00 (0.13%)	399.00 (0.38%)	399.00 (0.38%)	15/15	567.00	569.00 (0.35%)	571.00 (0.70%)	569.00 (0.35%)		
10/10	360.00	361.00 (0.28%)	361.00 (0.28%)	361.00 (0.28%)	13/17	549.00	553.00 (0.72%)	556.00 (1.26%)	555.00 (1.08%)		
10/10	382.50	383.00 (0.13%)	384.00 (0.39%)	386.00 (0.91%)	15/15	562.00	562.00 (0.00%)	564.00 (0.35%)	565.00 (0.53%)		
12/8	382.00	384.00 (0.52%)	386.00 (1.04%)	386.00 (1.04%)	17/13	584.50	585.00 (0.09%)	588.00 (0.60%)	587.00 (0.43%)		
10/10	353.00	354.00 (0.28%)	355.00 (0.56%)	354.00 (0.28%)	12/18	573.00	573.00 (0.00%)	573.00 (0.00%)	574.00 (0.17%)		
10/10	331.00	331.00 (0.00%)	337.00 (1.78%)	334.00 (0.90%)	17/13	502.50	503.00 (0.10%)	510.00 (1.47%)	509.00 (1.28%)		
10/10	396.50	401.00 (1.12%)	404.00 (1.86%)	402.00 (1.37%)	15/15	534.00	537.00 (0.56%)	540.00 (1.11%)	540.00 (1.11%)		
8/12	375.00	375.00 (0.00%)	378.00 (0.79%)	376.00 (0.27%)	13/17	504.50	507.00 (0.49%)	507.00 (0.49%)	511.00 (1.27%)		
7/13	367.00	371.00 (1.08%)	372.00 (1.34%)	372.00 (1.34%)	15/15	491.50	492.00 (0.10%)	495.00 (0.71%)	494.00 (0.51%)		
10/10	320.00	320.00 (0.00%)	322.00 (0.62%)	322.00 (0.62%)	13/17	570.50	576.00 (0.95%)	575.00 (0.78%)	577.00 (1.13%)		
9/11	367.50	368.00 (0.14%)	368.00 (0.14%)	368.00 (0.14%)	17/13	611.00	612.00 (0.16%)	613.00 (0.33%)	611.00 (0.00%)		
10/10	363.00	365.00 (0.55%)	367.00 (1.09%)	367.00 (1.09%)	14/16	550.00	553.00 (0.54%)	556.00 (1.08%)	556.00 (1.08%)		
12/8	382.50	384.00 (0.39%)	386.00 (0.91%)	388.00 (1.42%)	11/19	483.00	483.00 (0.00%)	483.00 (0.00%)	484.00 (0.21%)		
9/11	369.00	371.00 (0.54%)	372.00 (0.81%)	371.00 (0.54%)	19/11	548.00	553.00 (0.90%)	553.00 (0.90%)	553.00 (0.90%)		
11/9	377.00	377.00 (0.00%)	380.00 (0.79%)	380.00 (0.79%)	17/13	539.00	540.00 (0.19%)	543.00 (0.74%)	541.00 (0.37%)		
Avg.	365.72	367.03 (0.36%)	368.93 (0.89%)	368.63 (0.80%)		538.15	540.50 (0.43%)	542.63 (0.83%)	542.53 (0.82%)		

Outline

Problem Setting

Terminal Layouts

Container Flow

Yard Layouts

Yard Crane Systems

Twin Cranes

Policies

Results

CCSP

Solution Approach

Master Problem

Subproblem

Comp. Study

Conflict-Free Crane Scheduling in a Seaport Terminal

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University of Siegen, Department of Management Information Science, Germany

Scheduling Seminar, 24. May 2023

