# A COMPARISON OF STACKING EFFICIENCY FOR VARIOUS STRATEGIES OF SLOT ASSICNMENT IN CONTAINER YARDS 

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#### Abstract

This paper attempts to divide the containers into two categories--attributes that are known and unknown in advance. Ordered and random stacking strategies are simulated in a yard, which is treated as a single area or divided into twin areas. The simulation results in a single area have shown that random stacking strategy is more efficient than ordered stacking if the departure sequences of all containers are completely unknown. Layer-column-row or layer-row-column is the best ordered stacking strategy that has less unproductive moves than random stacking strategy, provided that all containers attributes are known in advance. Simulations results in twin areas have revealed that ordered stacking is in general superior to random stacking if the ratios of known attributes are not high. The number of unproductive moves for single area random stacking operation is much less than that for twin areas, therefore, dividing the yard into two sub-areas is not recommended.


Key words: simulation, slot assignment, container yard, ordered stacking, random stacking

## 1. INTRODUCTION

Container transportation is the major manner for the export and import general cargoes in the international trade. The import containers are shipped through vessels, berthed in the piers, unloaded in the port container terminals, temporarily stored at the marshalling yards, assembled and disassembled at the container freight stations, and then delivered to the consignee via land transportation. The export containers generally flow in a similar but reversed direction as shown in Figure 1. Container slot assignment is a preplanning procedure for container stowage both in the vessels and yards. Slot assignment is to allocate container boxes into certain slots. However, most operators assign the slots via experience, thus often cause inefficient usage of slot capacities with unnecessary restowage moves, which are referred to as the "unproductive moves." This represents an increase in operation cost.

Most previous studies on container transportation have emphasized on the economics of the containership or the overall improvement of productivity, loading and unloading of containers between the ships and quaysides in the container terminals. Little attention has been given on container slot management. As to the container stacking operation, the arrival and departure times of individual container should be taken into account. However, pervious related studies have over-simplified the variables that affect the efficiency of container stacking operation. Therefore, their results can only represent the optimization under limited conditions that may neither reduce unproductive moves nor conform to the practical operation.

Studies on container yard operation and management can be classified into three categories:
(1) yard planning and operation strategies; (2) quay crane scheduling and yard crane routing;
(3) slot assignment and productivity. Taleb-Ibrahimi et al. (1993) described handling and storage strategies for export containers at marine terminal and quantified their performance according to the amount of space and number of handling moves they required. By using queueing theory their study examined the minimal storage space needed to implement the recommended strategies under given traffic. It was found that to store those containers arrive earlier than their schedule in a dynamic temporary area and to move containers between storage areas in the yard can virtually eliminate the wasted space. Bernardo and Daganzo (1993) developed general expressions for the expected number of moves required to retrieve an import container from storage stacks under two different storage strategies (keep all stack the same size and segregate containers according to arrival time). They suggested that low variability in dwell times of containers favor segregating strategy. Lan and Kao (1998) developed six stacking strategies operated by three kinds of yard equipment (straddle carrier, transtainer, and forklift) and compared their efficiency. The operation times of yard crane includes the time of moving, storing, shuffling and shifting containers. By comparing the average operation times for various stacking strategies, they found equipment moving time has little affect on strategy rankings; while shuffling and shifting time dominates the rankings of stacking strategies.

Container terminal


Figure 1. The process of marine container transportation
In the area of crane scheduling and routing, Daganzo (1989), Peterkofsky and Daganzo (1990) suggested that algorithm for assigning quay cranes to container ships is a method that minimize the total delay cost. Their justification is that through the correspondence of yard cranes and quay cranes, the completion time of the individual crane can be about the same. Kim et al. (1999) suggested an optimal routing algorithm for a transfer crane during loading operations of export containers at container yard. The routing problem was formulated as a mixed integer programming with objective function to minimize the total handling time of a transfer crane, which included setup time in each yard bay and travel time between yard bays.

Little attention has been given to slot assignment and productivity. Chou et al. (1994) tried to construct the intelligent container slot management information system with expert system. Their study provided a more efficient (correct, rapid, reducing container shifting and searching) tool of slot assignment than a rule of thumb method adopted previously. Chen (1999a) classified the operation of container terminal into three sub-systems including ship operation, gate operation, and container storage sub-systems and discussed the unproductive
moves in the container yard. He cited that higher container storage did have a serious impact on the number of unproductive moves carried out, and that the major impact was on the operation of container departures. It suggested that terminal operators should maintain a good quality of container information received to reduce the impact of higher container stacking. With the macro point of view, Chen (1999b) compared the land productivity (TEUs/ha) of container yards of the major ports in Asia, Europe and North America and found that the productivity of the port container terminals in Asia was much higher than that in Europe and North America.

This paper attempts to divide the incoming and outgoing containers into two categories-attributes that are known and unknown in advance. Ordered and random stacking strategies are simulated in a container yard that is treated as a single area or divided into twin areas. In order to analyze the influences of ratios of known container attributes on the slot assignment performance, sensitivity scenario analysis is further conducted.

## 2. SLOT ASSIGNMENT STRATEGIES

In this paper, slot assignment in a single area represents a mixed stacking manner such that all containers are assigned to the same area, ignoring the attributes that are known or not in advance. By contrast, the assignment in twin areas is first to divide the yard into two subareas and then to assign the containers of known attributes in one sub-area and assign the ones of unknown attributes in the other. For simplicity, the container attributes are considered only the departure sequence, namely, the departure time of each container. We assume that the initial condition of the yard is empty and that the containers will be assigned on a first-come-first-serve basis. An ordered stacking strategy refers to as stacking the containers in one of the following six orders: column-row-layer, row-column-layer, column-layer-row, row-layercolumn, layer-column-row, and layer-row-column. A random stacking strategy indicates stacking containers randomly subject to the condition that any box cannot be stacked in suspension.

Lan and Kao (1998) compared the average operation times for various stacking strategies and found that equipment moving time has little affect on strategy rankings; while box shuffling/ shifting time will dominate. In other words, the number of unproductive moves determines the efficiency of a stacking strategy. The number of unproductive moves, in fact, depends upon the containers arrival times, rules of slot selection, and departure times. Among which slot selection is a key factor affecting the stowage efficiency. A general rule of thumb for slot selection is that the containers at upper layers should depart earlier than those at the lower layers to avoid shuffling/shifting moves. However, this criterion very often cannot be met in practice and thus inevitably creates unproductive moves.

### 2.1 Ordered Stacking Strategy

In this paper, six stacking orders are considered: column-row-layer, row-column-layer, column-layer-row, row-layer-column, layer-column-row, and layer-row-column. The column-row-layer stacking order is to select slots beginning with the first column through the last column in the first row and first layer and ending with the last column in the last row and last layer. This stacking order will first search for the columns holding the row and layer unchanged, and then do the same searches holding the layer unchanged, and then complete the searches until the last layer is reached. The remaining five stacking orders follow the same
searching algorithm but vary only with searching orders. The general algorithm of such ordered stacking strategy is shown in Figure 2, which can be explained as the following procedures.
Step 1: Search for all vacant slots that will not cause suspension assignment while container arrives.
Step 2: Sort all the vacant slots according to the reversed sequence of stacking order (e.g. the sorting order for column-row-layer is layer first, then row, then column.)
Step 3: Select a slot in the sorted order.
Step 4: Compare the departure time of designated container with the departure time of lower layer container.
Step 5: If the departure time of upper container is earlier, slot is assigned to the designated container; otherwise, skip the slot and go back to step 3. If there is no suitable slot for arriving container after comparing all the sorted slots, select the slot by using minimum or maximum rule. Stop. The minimum (maximum) rule indicates that summation of the differences between the designated container departure time and the lower-layer departure times are minimized (maximized).


Figure 2. Algorithm of ordered stacking strategy

### 2.2 Random Stacking Strategy

Unlike ordered stacking strategy that must follow one of the above-mentioned six stacking orders, a random stacking strategy will choose the vacant slots in random as long as any box is not stacked in suspension. The general algorithm of random stacking is shown in Figure 3, which can be explained as the following procedures.
Step 1: Search for all vacant slots while container aıives.
Step 2: Cluster the vacant slots by layer.
Step 3: Select one slot at lower layers in random.
Step 4: Compare the departure time of designated container with the departure time of lower layer container.
Step 5: If the departure time of upper container is earlier, slot is assigned to the designated container; otherwise, go back to step 3. If there is no suitable slot after n iterations, select the slot in random. Stop.


Figure 3. Algorithm of random stacking strategy

## 3. THE SIMULATION DATA

There are 150 containers to be assigned in the yard. Before they depart, no new containers arrive in this simulation analysis cycle. Each container must arrive and depart during the analysis cycle. The arrival and departure of each container are treated as individual events, thus there will be 300 events in total as illustrated in Table 1. Assume that the container yard has 90 slots with 3 columns, 10 rows, and 3 layers. Also assume that the slots are all vacant initially. Only $20-\mathrm{ft}$ containers are considered and a single transtainer is operated. When shuffling and shifting moves occur, containers are transferred away from the original slot to a
temporary space and then restored back to the original row and column. The temporary storage space is assumed always available.

Table 1 The simulation data

| Container | Sequence |  | Container | Sequence |  | Container | Sequence |  | Container | Sequence |  | Container | Sequence |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Arr. | Dep. |  | Arr. | Dep. |  | Arr. | Dep. |  | Arr. | Dep. |  | Arr. | Dep. |
| C001 | 1 | 41 | C031 | 31 | 32 | C061 | 76 | 201 | C091 | 126 | 257 | C121 | 177 | 241 |
| C002 | 2 | 42 | C032 | 33 | 142 | C062 | 77 | 200 | C092 | 127 | 256 | C122 | 178 | 240 |
| C003 | 3 | 43 | C033 | 34 | 143 | C063 | 78 | 199 | C093 | 128 | 255 | C123 | 179 | 283 |
| C004 | 4 | 44 | C034 | 35 | 144 | C064 | 79 | 198 | C094 | 129 | 269 | C124 | 180 | 223 |
| C005 | 5 | 45 | C035 | 36 | 145 | C065 | 80 | 197 | C095 | 130 | 270 | C125 | 181 | 222 |
| C006 | 6 | 46 | C036 | 37 | 170 | C066 | 81 | 196 | C096 | 131 | 268 | C126 | 182 | 221 |
| C007 | 7 | 66 | C037 | 38 | 169 | C067 | 82 | 195 | C097 | 132 | 267 | C127 | 183 | 220 |
| C008 | 8 | 65 | C038 | 39 | 168 | C068 | 83 | 194 | C098 | 133 | 266 | C128 | 184 | 219 |
| C009 | 9 | 64 | C039 | 40 | 167 | C069 | 84 | 193 | C099 | 134 | 265 | C129 | 185 | 298 |
| C010 | 10 | 63 | C040 | 47 | 166 | C070 | 85 | 192 | C100 | 146 | 264 | C130 | 202 | 271 |
| C011 | 11 | 62 | C041 | 48 | 165 | C071 | 86 | 191 | C101 | 147 | 263 | C131 | 203 | 300 |
| C012 | 12 | 61 | C042 | 49 | 164 | C072 | 87 | 141 | C102 | 148 | 262 | C132 | 204 | 299 |
| C013 | 13 | 60 | C043 | 50 | 163 | C073 | 88 | 272 | C103 | 149 | 261 | C133 | 205 | 297 |
| C014 | 14 | 59 | C044 | 51 | 162 | C074 | 89 | 273 | C104 | 150 | 260 | C134 | 206 | 218 |
| C015 | 15 | 91 | C045 | 52 | 161 | C075 | 90 | 277 | C105 | 151 | 233 | C135 | 207 | 217 |
| C016 | 16 | 92 | C046 | 53 | 113 | C076 | 101 | 276 | C106 | 152 | 232 | C136 | 208 | 216 |
| C017 | 17 | 93 | C047 | 54 | 114 | C077 | 102 | 275 | C107 | 153 | 231 | C137 | 209 | 215 |
| C018 | 18 | 94 | C048 | 55 | 119 | C078 | 103 | 274 | C108 | 154 | 234 | C138 | 210 | 287 |
| C019 | 19 | 97 | C049 | 56 | 118 | C079 | 104 | 227 | C109 | 155 | 236 | C139 | 211 | 288 |
| C020 | 20 | 96 | C050 | 57 | 117 | C080 | 105 | 226 | C110 | 156 | 235 | C140 | 212 | 289 |
| C021 | 21 | 95 | C051 | 58 | 116 | C081 | 106 | 225 | C111 | 157 | 239 | C141 | 213 | 290 |
| C022 | 22 | 100 | C052 | 67 | 115 | C082 | 107 | 230 | C112 | 158 | 238 | C142 | 214 | 296 |
| C023 | 23 | 99 | C053 | 68 | 120 | C083 | 108 | 229 | C113 | 159 | 237 | C143 | 224 | 295 |
| C024 | 24 | 98 | C054 | 69 | 121 | C084 | 109 | 228 | C114 | 160 | 282 | C144 | 244 | 294 |
| C025 | 25 | 135 | C055 | 70 | 122 | C085 | 110 | 251 | C115 | 171 | 281 | C145 | 245 | 293 |
| C026 | 26 | 136 | C056 | 71 | 186 | C086 | 111 | 252 | C116 | 172 | 280 | C146 | 246 | 292 |
| C027 | 27 | 137 | C057 | 72 | 187 | C087 | 112 | 253 | C117 | 173 | 279 | C147 | 247 | 291 |
| C028 | 28 | 138 | C058 | 73 | 188 | C088 | 123 | 254 | C118 | 174 | 278 | C148 | 248 | 286 |
| C029 | 29 | 139 | C059 | 74 | 189 | C089 | 124 | 259 | C119 | 175 | 243 | C149 | 249 | 285 |
| C 030 | 30 | 140 | C060 | 75 | 190 | C090 | 125 | 258 | C120 | 176 | 242 | C150 | 250 | 284 |

Note: 'Arr.' is the arrival sequence of containers; 'Dep.' is the departure sequence of containers. In this simulation, the arrival or departure times are represented by the sequence.

## 4. SIMULATION RESULTS IN A SINGLE AREA

### 4.1 Ordered Stacking Strategy

The simulation results for ordered stacking strategies in a single area are shown in Table 2. It is found that completely known departure sequences has overwhelmed the case that departure sequences are completely unknown in advance, no matter what stacking orders being utilized. Similarly, selecting slots by the "minimum rule" will obtain less unproductive moves than by the "maximum rule" for each of the six stacking orders. In the case of completely known attributes, both layer-column-row and layer-row-column stacking orders obtain the minimum unproductive moves, which agrees to the study of Lan and Kao(1998).

Notice that the numbers of unproductive moves are all the same if one swaps the stacking orders by column and by row without being intervened by layer. This finding indicates that
column and row can be viewed as one dimension in the space vector so that one can reduce the dimensions in slot assignment. The above results imply that strategy of "stack as high as possible" should be employed when departure sequences of containers are known in advance and that strategy of "stack the same size" should be used when departure sequences of containers are unknown. This implication also agrees to the suggestions by Bernardo and Daganzo (1993).

Table 2 Unproductive moves for ordered stacking in: a single area
unit : moves

| Container attributes | Departure sequences known in advance | Departure sequences <br> unknown in advance |  |
| :--- | :---: | :---: | :---: |
|  | "Minimum rule" |  |  |
| Layer-column-row | 19 | 44 | 175 |
| Layer-row-column | 19 | 44 | 175 |
| Row-column-layer | 48 | 69 | 84 |
| Column-row-layer | 48 | 69 | 84 |
| Row-layer-column | 52 | 65 | 135 |
| Column-layer-row | 32 | 71 | 107 |

### 4.2 Random Stacking Strategy

Random stacking strategy is simulated by comparing the unproductive moves as well as CPU times for different scenarios by varying the ratios of known container attributes from $0 \%$, $30 \%, 50 \%, 80 \%$, to $100 \%$ and varying the maximum slot selection iterations N from $2,4,6,8$, to 10 times. However, in the case of $0 \%$ known attributes, there are no departure sequences to be compared, N is thus set equal to 1 . Consequently, the total number of scenarios is 21 . For each scenario we conduct 50 simulation runs and summarize the average CPU times, the minimum, maximum, average, and standard deviation of unproductive moves as shown in Table 3.

Notice that if the ratios of known attributes increase, the number of unproductive moves will decrease. For instance, the average number of unproductive moves is around 20 for $100 \%$ known attributes while it grows as high as 70 for $30 \%$ known attributes. We also notice that the unproductive moves decline as the maximum slot selection iterations ( N ) increase. In the case of $80 \%$ known attributes, the average number of unproductive moves is around 60 for 2 iterations while it declines as low as 34 for 10 iterations.

Figure 4 through Figure 7 represent the details of cumulative times occurred for unproductive moves at various maximum slot selection iterations (N) for $100 \%, 80 \%, 50 \%$, and $30 \%$ known attributes, respectively. We notice that N has the most significant influence on the number of unproductive moves for $100 \%$ known attributes; while N becomes less and less significant as the ratios of known attributes decrease.

Table 3 Simulation results for random stacking in a single area ( 50 simulation runs)

| Ratios of <br> known <br> attributes | Max. slot <br> selection <br> iteration <br> $(\mathrm{N})$ | CPU times <br> (seconds/run) | Number of unproductive moves (moves) |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | 1 | 11.32 | 60 | 89 | 74.46 | 6.59 |
| $0 \%$ | 1 | 11.54 | 59 | 86 | 73.34 | 7.11 |
| $30 \%$ | 2 | 11.68 | 56 | 83 | 71.38 | 7.06 |
|  | 4 |  |  | Maximum | Average | Standard <br> deviation |


| Ratios of known attributes | Max. slot selection iterations <br> (N) <br> 6 <br> 8 <br> 10 | CPU times (seconds/run) <br> 11.62 <br> 11.64 <br> 11.78 | Number of unproductive moyes (moves) |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  | Minimum | Maximum | Average | Standard deviation |
|  |  |  | 58 | 85 | 69.66 | 6.46 |
|  |  |  | 54 | 81 | 70.98 | 6.62 |
|  |  |  | 60 | 90 | 70.88 | 7.33 |
| 50\% | 2 | 11.48 | 54 | 87 | 69.66 | 6.84 |
|  | 4 | 11.66 | 45 | 78 | 62.50 | 6.53 |
|  | 6 | 11.76 | 50 | 71 | 61.74 | 5.26 |
|  | 8 | 11.90 | 52 | 71 | 59.82 | 4.36 |
|  | 10 | 11.82 | 45 | 72 | 59.20 | 6.38 |
| 80\% | 2 | 11.58 | 50 | 72 | 60.96 | 5.85 |
|  | 4 | 11.86 | 35 | 63 | 49.54 | 6.40 |
|  | 6 | 12.10 | 31 | 52 | 41.48 | 4.42 |
|  | 8 | 12.26 | 24 | 46 | 35.98 | 4.29 |
|  | 10 | 12.38 | 20 | 44 | 34.84 | 4.73 |
| 100\% | 2 | 11.42 | 45 | 70 | 56.10 | 6.44 |
|  | 4 | 11.76 | 26 | 56 | 38.16 | 5.47 |
|  | 6 | 12.04 | 19 | 43 | 29.26 | 5.22 |
|  | 8 | 12.28 | 14 | 36 | 23.20 | 4.87 |
|  | 10 | 12.58 | 11 | 33 | 20.88 | 5.14 |



Unproductive moves
Figure 4. Cumulative times occurred vs. unproductive moves for single area random stacking ( $100 \%$ known attributes)

A Comparison of Stacking Efficiency for Various Strategies of Slot,Assignment in Container Yards


Figure 5. Cumulative times occurred vs. unproductive moves for single area random stacking (80\% known attributes)


Figure 6. Cumulative times occurred vs. unproductive moves for single area random stacking (50\% known attributes)


Figure 7. Cumulative times occurred vs. unproductive moves for single area random stacking (30\% known attributes)

Figures 8 through 11 further depict the CPU time, minimum, maximum, and average unproductive moves versus maximum iterations of slot selection for various ratios of known attributes. Notice that CPU times do not vary drastically when the ratios of known attributes and the maximum slot selection iterations change. Slightly longer CPU times are required due to more comparisons made, as the ratios of known attributes or the number of iterations increases. By contrast, the minimum, maximum, and average unproductive moves drop more sensitively as the iterations or ratios of known attributes increase.


Figure 8. CPU time vs. maximum iterations for single area random stacking


Figure 9. Min. unproductive moves vs. maximum iterations for single area random stacking


Figure 10. Max. unproductive moves vs. maximum iterations for single area random stacking


Figure 11. Average unproductive moves vs. maximum iterations for single area random stacking

## 5. SIMULATION RESULTS IN TWIN AREAS

In order to reduce reposition moves, Taleb-Ibrahimi et al. (1993) proposed a concept of "roughpile" to stacking the early arrival containers - those arriving too early to find empty available slots. This paper follows such a concept and attempts to divide the container yard into two sub-areas. Containers with known attributes will be assigned in one sub-area while the other sub-area temporarily accommodates the containers with unknown attributes. The number of slots allocated to both sub-areas is proportional to the ratios of known and unknown attributes.

### 5.1 Ordered Stacking Strategy

The simulation results for ordered stacking strategy in a single area conclude that layer-
column-row or layer-row-column stacking order is the most efficient for known attribute containers, since both stacking orders can leave more unoccupied lower-layer slots for the arriving containers than other stacking orders. For the known attributes containers, only the "layer-column-row" ordered stacking strategy is simulated in twin areas. The simulation results for various known attributes are shown in Table 4.

Table 4 Simulation results for ordered stacking strategy in twin areas

| Ratios of known attributes | Attributes | Number of slot allocated | Max. number of containers in the yard | Unproductive moves |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  | $\begin{gathered} \text { "Maximum } \\ \text { rule" } \end{gathered}$ | $\begin{gathered} \text { "Minimum } \\ \text { rule" } \\ \hline \end{gathered}$ |
| 100\% | Known | 90 | 73 | 44 | 19 |
|  | Unknown | 0 | 0 | 0 | 0 |
|  | Total | 90 | 73 | 44 | 19 |
| 90\% | Known | 78 | 73 | 55 | 29 |
|  | Unknown | 12 | 8 | 6 | 6 |
|  | Total | 90 | 81 | 61 | 35 |
|  | Known | 81 | 73 | 41 | 25 |
|  | Unknown | 9 | 8 | 11 | 11 |
|  | Total | 90 | 81 | 52 | 36 |
| 80\% | Known | 72 | 72 | 65 | 40 |
|  | Unknown | 18 | 14 | 21 | 21 |
|  | Total | 90 | 86 | 86 | 61 |
|  | Known | 75 | 72 | 55 | 30 |
|  | Unknown | 15 | 14 | 27 | 27 |
|  | Total | 90 | 86 | 82 | 57 |
| 70\% | Known | 66 | 65 | 42 | 30 |
|  | Unknown | 24 | 20 | 38 | 38 |
|  | Total | 90 | 85 | 80 | 68 |
|  | Known | 69 | 65 | 31 | 24 |
|  | Unknown | 21 | 20 | 42 | 42 |
|  | Total | 90 | 85 | 73 | 66 |
| 60\% | Known | 57 | 56 | 35 | 26 |
|  | Unknown | 33 | 25 | 42 | 42 |
|  | Total | 90 | 81 | 77 | 68 |
|  | Known | 60 | 56 | 28 | 18 |
|  | Unknown | 30 | 25 | 52 | 52 |
|  | Total | 90 | 81. | 80 | 70 |
| 50\% | Known | 45 | 41 | 38 | 31 |
|  | Unknown | 45 | 38 | 42 | 42 |
|  | Total | 90 | 79 | 80 | 73 |
|  | Known | 48 | 41 | 22 | 17 |
|  | Unknown | 42 | 38 | 48 | 48 |
|  | Total | 90 | 79 | 70 | 65 |
| 40\% | Known | 36 | 34 | 32 | 31 |
|  | Unknown | 54 | 45 | 47 | 77 |
|  | Total | 90 | 79 | 15 | 4 |
|  | Known | 42 | 34 | 15 | 14 |
|  | Unknown | 48 | 45 | 62 | 62 |
|  | Total | 90 | 79 | 77 | 76 |
| 30\% | Known | 21 | 19 | 17 | 16 |
|  | Unknown | 69 | 61 | 73 | 73 |
|  | Total | 90 | 80 | 90 | 89 |
|  | Known | 27 | 19 | 5 | 7 |
|  | Unknown | 63 | 61 | 84 | 84 |
|  | Total | 90 | 80 | 89 | 91 |


| Ratios of known attributes | Attributes | Number of slot allocated | Max. number of containers in the yard | Unproductive moves |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  | $\begin{aligned} & \text { "Maximum } \\ & \text { rule" } \\ & \hline \end{aligned}$ | $\begin{gathered} \text { "Minimum } \\ \text { rule" } \end{gathered}$ |
| 20\% | Known | 15 | 13 | 12 | 4 |
|  | Unknown | 75 | 64 | 95 | 95 |
|  | Total | 90 | 77 | 107 | 99 |
|  | Known | 18 | 13 | 4 | 3 |
|  | Unknown | 72 | 64 | 102 | 102 |
|  | Total | 90 | 77 | 106 | 105 |
| 10\% | Known | 9 | 8 | 8 | 5 |
|  | Unknown | 81 | 68 | 102 | 102 |
|  | Total | 90 | 76 | 110 | 107 |
|  | Known | 12 | 8 | 2 | 3 |
|  | Unknown | 78 | 68 | 110 | 110 |
|  | Total | 90 | 76 | 112 | 113 |
| -0\% | Known | 0 | 0 | 0 | 0 |
|  | Unknown | 90 | 73 | 84 | 84 |
|  | Total | 90 | 73 | 84 | 84 |

By comparing Tables 2 and 4, we notice that in the two extreme situations (attributes that are completely known and completely unknown), the simulation results in twin areas are just the same as those in a single area. From Table 4 we conclude that as the ratios of known attributes increase the unproductive moves decrease, which is further depicted in Figure 12.


Figure 12. Min. unproductive moves for ordered stacking in twin areas
The simulation also finds that the number of slots allocated to each sub-area would influence the unproductive moves. There is no guarantee that dividing the yard into two sub-areas exactly according to the ratios of known and unknown attributes will obtain the best result. In fact, fine tunes for slots allocation in these two sub-areas may gain efficiency. Figure 13 shows the optimal ratios of slots reserved for known attributes containers. The dotted 45degree line represents allocating the slots in proportional to the ratios of known attributes; the solid line represents the optimum ratios for allocating the slots in this simulation example. It is found that all the optimum ratios diverge from the 45 -degree line except for the $10 \%$ known attributes case. While dealing with slots assignment in twin-areas, sketching a chart similar to Figure 13 can be a useful guide for yard planning.


Figure 13. Optimum ratios of slots reserved for known attributes containers

### 5.2. Random Stacking Strategy

Random stacking strategy in twin areas is simulated as in the single area case, except for the two extremes: attributes completely known in advance ( $100 \%$ ) and completely unknown ( $0 \%$ ). The total number of scenarios is 15 . For each scenario we also conduct 50 simulation runs. The average and minimum unproductive moves for various scenarios are shown in Figure 14 and Table 5.


Figure 14. Min. unproductive moves vs. maximum iterations for twin-areas random stacking
Table 5 Simulation results for random stacking strategy in twin areas ( 50 simulation runs)

| Ratios of known attributes | Maximum slot selection iterations (N) | Number of unproductive moves (moves) |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Average |  |  | Minimum |  |  |
|  |  | Total | Known | Unknown | Total | Known | Unknown |
| 80\% | 2 | 85.64 | 68.68 | 16.96 | 81 | 62 | 11 |
|  | 4 | 84.38 | 67.84 | 16.54 | 79 | 61 | 13 |
|  | 6 | 74.80 | 58.12 | 16.68 | 68 | 52 | 14 |
|  | 8 | 71.10 | 54.36 | 16.74 | 63 | 49 | 12 |
|  | 10 | 67.58 | 50.46 | 17.12 | 56 | 41 | 13 |


| Ratios of known attributes | Maximum slot selection iterations$(\mathrm{N})$ | Number of unproductive moves (moves) |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Average |  |  | Minimum |  |  |
|  |  | Total | Known | Unknown | Total | Known | Unknown |
| 50\% | 2 | 105.42 | 38.54 | 66.88 | 91 | 31 | 50 |
|  | 4 | 102.30 | 34.78 | 67.52 | 86 | 30 | 49 |
|  | 6 | 99.94 | 33.56 | 66.38 | 83 | 28 | 48 |
|  | 8 | 98.52 | 32.74 | 65.78 | 79 | 24 | 49 |
|  | 10 | 98.82 | 31.18 | 67.64 | 73 | 21 | 50 |
| 30\% | 2 | 113.16 | 40.82 | 72.34 | 101 | 37 | 64 |
|  | 4 | 110.80 | 38.92 | 71.88 | 98 | 35 | 65 |
|  | 6 | 106.50 | 37.14 | 69.36 | 98 | 34 | 54 |
|  | 8 | 105.10 | 36.38 | 68.72 | 96 | 33 | 55 |
|  | 10 | 104.12 | 35.98 | 68.14 | 93 | 31 | 59 |

It is found that total unproductive moves decrease as the ratios of known attributes increase. For higher ratios of known attributes (e.g. 80\%), the unproductive moves come mainly from the sub-area with known attributes and the other way around for lower ratios of known attributes such as $30 \%$.

## 6. COMPARISONS AND CONCLUSIONS

Comparing the results for ordered and random stacking strategies in a single area (Tables 2 and 3), one will find that the best ordered stacking strategy, layer-column-row and layer-rowcolumn stacking orders, is slightly more efficient (has less unproductive moves) than random stacking strategy, provided that all attributes are known in advance. If the departure sequences of all containers are completely unknown in advance, however, random stacking strategy is more efficient than ordered stacking strategy.

Similarly, the simulations results for ordered and random stacking strategies in twin areas (Tables 4 and 5) reveal that ordered stacking is in general superior to random stacking if the ratios of known attributes are not very high. The random stacking strategy may obtain better efficiency only when the ratio of known attributes is more than $80 \%$. This result suggests that random stacking strategy in twin areas be used only when the yard operators have sufficient information about containers in advance.

If one further compares the results of random stacking in a single area and in twin areas (Tables 3 and 5), one will obviously find the performance for single area random stacking is much better than those for twin areas. The main reason is that once the yard is divided into two sub-areas, the freedom of selecting suitable slots for arrival containers will be reduced, as a consequence the unproductive moves increase.

The simulation results for ordered stacking strategies in a single area conclude that selecting slots by the "minimum rule" will obtain more efficiency than by the "maximum rule" for each of the six stacking orders. In the case of completely known attributes, both layer-column-row and layer-row-column stacking orders can obtain the minimum unproductive moves. The numbers of unproductive moves are all the same if one swaps the stacking orders by column and by row without being intervened by layer, implying that column and row can be viewed
as one dimension in the slot assignment. For random stacking strategy in a single area, if the ratios of known attributes containers increase, the number of unproductive moves decreases. These results suggest that strategy of "stack as high as possible" be used when departure sequences of more containers are known in advance and that strategy of "stack the same size" be used when departure sequences of more containers are unknown. The number of unproductive moves for single area random stacking operation is much less than that for twin areas, therefore, dividing the yard into two sub-areas is not recommended unless new evidences can be found for further analysis.

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