Final project assignment: Simulation of a base scenario

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1 Introduction

During this report, the final assignment of the 'Yard storage assignment problem' will be discussed. Over the course of past labs, a serious amount of work and effort went in to designing a simulation which could visualise a given port complex. The simulation is focused on the storage situation of this yard. During this report, the basics design choices will be discussed, as well as the results of the simulation. The basic technology used is Python. The code is written as dynamic as possible, using global variables and booleans to variate parameters and the overall flow of the simulation. It is based on a discrete event simulation, with the possibility of online simulation. To refresh the situation in brief, the goal is to simulate a yard, in which containergroups¹ come and go. They can arrive from vessels or from trucks and trains. Each container needs to be stored on the yard for a specific duration. The goal is to simulate the storage in the yard, as a result of the in and out flow.

To recap, during the first lab, the main focus was on the samples that the existing data brought along. The intention was to be able to sample them in the further course of the project, in order to approximate reality. During the second assignment was the objective to setup a base scenario to simulate, and get first results. The samples determined in previous sessions were converted to usable distributions, and where used to generate the parameters that come with the container arrival and departure schedule. With a basic simulation scenario, the first results could be examined. Important to note however is that during the development and design of the sample functions, some minor errors occurred. The problem originated from a misinterpretation of the graphs out of the first reports, which led to a big underestimation of the amount of containers that were generated. This was also insinuated while writing the second report. However, when designing the final simulation, the mistake came up again, and normally it was fixed, and it should no longer pose a problem.

The goal of this last assignment is to put all the pieces together, and make the simulation fully functional and usable. Three extra scenarios are implemented, which could give some new insights in the way the yard works. And alongside these extra scenarios and the the solution of the previously made mistake, a visualisation was implemented. This was one of the core goals of this last semester and really the cherry on top for this course. It brought the whole project together, and made all the realisations visible, as well as give a real insight into the mechanisms of the movements of all the different elements in this yard.

¹Containers arrive only in group. Containers are usually not looked at individually. This means they can't be split up most of the time, they are stored in the same place, they enter and leave the yard at the same time.

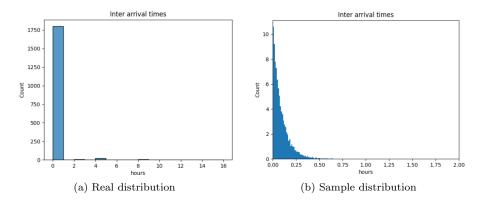


Figure 1: Inter-arrival times

2 Probability distributions

The simulation utilizes probability distributions derived from the input data provided from a real yard, from Ir. E. Thanos. Each distribution is designed to have the same average results as the input data. The simulation consists of generating container group samples, each possessing different characteristics that are determined by the distributions.

2.1 Inter arrival time

The sampling frequency of container groups is a critical parameter in the simulation. In the original input data, container groups frequently arrived at the same time on the same vessel, leading to a high occurrence of zero inter-arrival times, shown in Figure 1a. Consequently, the average inter-arrival time has a very low value of 0.092 hours or 5 minutes and 30 seconds.

To ensure a representative distribution, this average value had to be present in our sample distribution. To represent the steepness of the graph, an exponential function was used, resulting in the distribution shown in Figure 1b.

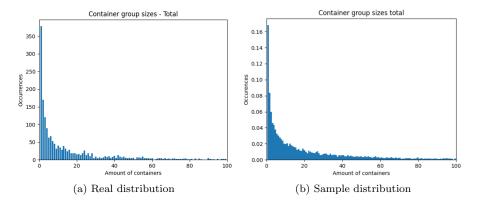


Figure 2: Container group sizes

2.2 Container group size

The container group sizes in the input data indicate significant variance, ranging from single-container groups to groups with over 2000 containers. This strong variance caused a difficult decision in determining an appropriate distribution. In the end, a Weibull distribution was chosen to achieve a steep descent at the lower end while simultaneously allowing for the possibility of larger group sizes. The average size of container groups in the input data, as shown in Figure 2a, is 32 containers. The Weibull distribution used for this sample generation is shown in Figure 2b.

Considering the previous average outcome, we can determine how many containers are generated each week. This number corresponds to the amount of containers getting transported each week. The result is almost equal to the amount of containers from the input data, thereby validating the average values of the previous distributions.

$$Generated_containers = \frac{Total_time}{inter_arrival_time} \cdot Average_container_group_size \tag{1}$$

$$= \frac{168}{0.091} \cdot 32 \tag{2}$$

$$\approx 59000\tag{3}$$

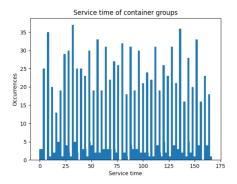


Figure 3: Service time sample distribution

2.3 Service time

The service time of each container group represents how long they stay in the yard before departing. The input data revealed a uniform distribution ranging from zero to 166 hours, shown in Figure 3. However, it is important to note that this distribution solely represents the container groups falling under transshipment. The other kind of container groups (export and import) always have a service time of 48 hours.

While it would be interesting to consider generating consistent container groups with a service time of 48 hours, we chose to simplify the distribution due to the larger number of transshipment container groups compared to the other types. The resulting distribution is a uniform distribution between zero and 166 hours.

2.4 Container type

Each container group can be of normal or reefer type. This distribution was based upon the input analysis of Nick De Bruyckere, Enrique Miron and Dries Van de Velde represented in Figure 4. Normal containers and reefer container occur respectively 69% and 31% of the times.

2.5 Arrival and departure points

The arrival and departure positions of vessels and trucks are chosen randomly from the available locations. The selection of either a vessel location or a truck

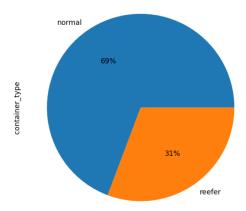


Figure 4: Container type analysis

location depends on the flow type, which will be discussed later.

2.6 Flow type

Each container group can be categorized as either export or import. In the input data, all groups that were categorized as transshipment are now categorized as export. The distribution of these flow types is based on the proportion of containers in the input data belonging to each category, resulting in 81% export and 19% import.

For the container groups classified as export, further division was necessary to determine their berthing locations and potential truck locations. This is because transshipment's would go from vessel to vessel, while true exports from truck to vessel. This distribution resulted in 69% transshipment's and 31% true export.

3 Algorithm

In this section the flow and the architectural and design will be elaborated and discussed. Because this code was designed over different steps, with it's own goals, the program tends to be very modular. This is particularly handy for possible code reuse for now or in the future.

3.1 Amount of simulations

The first and maybe most primary parameter to know is the amount of simulations that needs to be run to get significant results. This can be calculated by the following formula:

$$S = \sqrt{\frac{\sum_{i=1}^{n} (X_i - \overline{X})^2}{n-1}}$$

$$\frac{S}{\sqrt{k}} < d$$

The resulting value of the simulation we wanted to take in account, is the travel distance. S the sample variance, the variance of our results. The number of simulations, so the value we want to calculate is k. The accepted standard deviation is d. This is a threshold we want to achieve, and can be chosen in function of the given results. X represents a system result of the simulation. In our case is this the average or total travel distance gotten from running the simulation. When the sample variance based on the k values is within an acceptable range, the calculation is stopped and the value of k is chosen for the amount of simulations that needs to be run.

For the total distance the accepted deviation is 1000. If we look at the magnitude of the total travel distance, we see it surpasses a million. A deviation of a thousands seems in that case reasonable. The total distance travelled is a much larger value than the average, because of this the accepted deviation is larger. From this information we can conclude that at least 120 simulations must be done to get consistent results.

3.2 Flow

Because of the nature of a simulation, where multiple scenarios need to be tested, it was a challenge to design and structure the program in such a way that the flow could be manipulated without making drastic internal changes. The flow can be manipulated by the use of booleans which map out the path. Checks are present to throw Exceptions, so that the booleans (which are some sort of input parameters, and are in the GUI implemented in this way, but more on that later) can only be configured in such a way that they map out a predefined scenario. Here 4 booleans where used:

1. ARRIVAL BASED

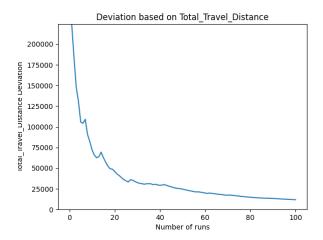


Figure 5: Deviation based on total travel distance

- 2. DEPARTURE BASED
- 3. CLOSEST
- 4. LOWEST OCCUPANCY
- 5. MIXED RULE
- 6. SPLIT UP

3.3 Core

The program is event based, which means the simulation timer jumps from event to event. It achieves this by keeping two different list which hold events, one where containers arrive at the yard, and one where containers depart from the yard. Every time a container is generated, a new arrival is being scheduled based on the interarrival time sampling function. When it arrives, it is checked if it can be placed on a place in the yard. If it can, a yardblock where it can be stored is selected based on the scenario. If it can't, it is rejected. At an event where a container departs, the container is removed from the yard. For every event happening, all the statistics are updated. This process repeats itself until the simulation time is reached.

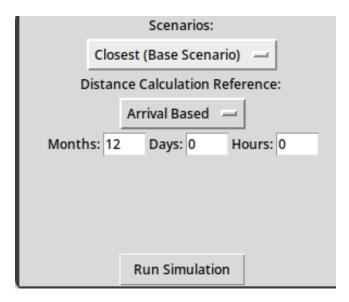


Figure 6: Intro screen

3.4 Visualisation

The visualisation is done by the use of TKinter. Tkinter is a Python library used for creating graphical user interfaces (GUIs). The name Tkinter comes from Tk interface, referring to the fact that it is based on the Tk GUI toolkit. One of the advantages of Tkinter is that it is included with the standard Python distribution, so you don't need to install any additional libraries. This makes it easily accessible for beginners and convenient for developing cross-platform applications.

Overall, Tkinter is a powerful tool for developing graphical applications in Python, enabling you to create intuitive and interactive user interfaces for your programs.

Some keyfeatures of the simulation is that the possibility to setup a flow using the intro screen, seen in Figure 6. Here you can setup all the necessary parameters to run a simulation, as well as the duration.

The visualisation is multithreaded, which allows it to run smooth. It is possible to run both the visualisation and gatter results formatted in a LaTex table (which has to be run multiple times to get correct results). But a strong computer is needed to pull this off. Because of the multithreaded visualisation was it not usable, but in case of stronger pc's, it should work fluently. More on



Figure 7: Progress bar of the simulations being run in order to get results

performance later in Section 5.

When the graphical representation is running, the boats are represented on the water on top. They appear and disapear if they are needed. The yard is represented by the blocks of different size based on their respective capacity, mostly in flashy green. It is noticable that the reefer blocks are very small.

4 What-if scenarios

A significant part of the assignment was to implement some scenarios in order to look for the most 'efficient' scenarios, or more generally speaking, see the impact of these scenarios. This is also an opportunity to test out the visualisation, and see in what manner the yard works.

As stated in the previous reports, two different approaches to block assignments are implemented. This still applies to all the scenarios described in this section, and so for most scenarios the two different approaches of block assignment are possible. The block assignment rule has affect on which block is chosen to store a containergroup. The two different situations studied here are arrival based and departure based. Arrival based and departure based are both based on the minimal distance between 2 points. The yard block chosen is the closest block to the arrival point, in case of arrival based, or closest to the departure point, in case of departure based.

4.1 Base Scenario

The base scenario stays the same as discussed in the previous report, where the decision rule is that containergroup that arrives, if there is space in the yard. This will be referred to as FIFO (First In First Out). This apply's to arrival of containers, and wether or not they are stored in the yard. FIFO says that the first container that arrives, has a priority over the ones which arrive after the first one. If there is no space for an arriving containergroup, it will be rejected. The block assignment determines which yardblock the respective containers.

BESCHRIJVEN RESULTATEN...

| Containers Rejected | 548306.083 |
|---|----------------|
| CG Rejected | 4034.933 |
| Normal Rejected | 9816.133 |
| Reefer Rejected | 538489.95 |
| Total Travel Distance | 5314784151.897 |
| AVG Travel Distance Containers | 1754.928 |
| Portion of YB close to full (at some point) | 0.698 |
| Portion of YB never used | 0.195 |
| Portion of YB close to full (average) | 0.698 |
| AVG daily total Occupancy | 0.745 |

Table 1: FIFO ARRIVAL-BASED

| Containers Rejected | 549260.158 |
|---|---------------|
| CG Rejected | 4029.158 |
| Normal Rejected | 9932.708 |
| Reefer Rejected | 539327.45 |
| Total Travel Distance | 5823736051.32 |
| AVG Travel Distance Containers | 1923.124 |
| Portion of YB close to full (at some point) | 0.591 |
| Portion of YB never used | 0.258 |
| Portion of YB close to full (average) | 0.591 |
| AVG daily total Occupancy | 0.673 |

Table 2: FIFO ARRIVAL-BASEDDEPARTURE-BASED

4.2 Smallest Remaining capacity

The first new scenario is one where all containers of the same containergroup must be stored in the same yardblock. The containers are stored in the yardblock with the largest remaining capacity, which means the yard should fill up gradually and balanced over all the possible storage blocks. Due to the lack of explicit emphasis, two possible interpretations were available for the "remaining capacity" concept. In this implementation, the choice was made to work with the absolute number of available container slots. An alternative interpretation could have been to consider normalized remaining capacity, in other words, the percentage of capacity that is still available. In case there are two yardblocks with the exact same capacity left, the closest one is taken (based on the block assignment rule).

| Containers Rejected | 551553.892 |
|---|----------------|
| CG Rejected | 4053.15 |
| Normal Rejected | 12869.05 |
| Reefer Rejected | 538684.842 |
| Total Travel Distance | 6622102730.796 |
| AVG Travel Distance Containers | 2184.101 |
| Portion of YB close to full (at some point) | 0.648 |
| Portion of YB never used | 0.05 |
| Portion of YB close to full (average) | 0.648 |
| AVG daily total Occupancy | 0.842 |

Table 3: FIFO DEPARTURE-BASED

BESCHRIJVEN RESULTATEN...

| Containers Rejected | 650443.533 |
|---|----------------|
| CG Rejected | 5013.842 |
| Normal Rejected | 48756.217 |
| Reefer Rejected | 601687.317 |
| Total Travel Distance | 8270153316.425 |
| AVG Travel Distance Containers | 2728.917 |
| Portion of YB close to full (at some point) | 0.453 |
| Portion of YB never used | 0.245 |
| Portion of YB close to full (average) | 0.453 |
| AVG daily total Occupancy | 0.645 |

Table 4: LOWEST OCCUPANCY ARRIVAL & DEPARTURE-BASED

4.3 Possible split ups

This scenario states that containergroups could possibly be split up into individual containers, which each of which can be considered separately. This means that a yardblock does not has to hold a full group, so this means larger containergroups should be handled far more easy. Also the smaller yardblock should be able to have more use in the grand scheme of things. The yardblocks chosen to store containers, are the blocks closest to the arrival or departure point (based on the decision rule), and which have space left to store one or more containers. So the focus is really on which block is the closest, and can hold one or more containers.

BESCHRIJVEN RESULTATEN...

| Containers Rejected | 651509.433 |
|---|----------------|
| CG Rejected | 5014.367 |
| Normal Rejected | 49211.8 |
| Reefer Rejected | 602297.633 |
| Total Travel Distance | 8268808654.143 |
| AVG Travel Distance Containers | 2725.312 |
| Portion of YB close to full (at some point) | 0.447 |
| Portion of YB never used | 0.245 |
| Portion of YB close to full (average) | 0.447 |
| AVG daily total Occupancy | 0.646 |

Table 5: LOWEST OCCUPANCY DEPARTURE-BASED

| Containers Rejected | 650775.533 |
|---|----------------|
| CG Rejected | 5008.1 |
| Normal Rejected | 48856.217 |
| Reefer Rejected | 601919.317 |
| Total Travel Distance | 8263128846.329 |
| AVG Travel Distance Containers | 2725.798 |
| Portion of YB close to full (at some point) | 0.465 |
| Portion of YB never used | 0.245 |
| Portion of YB close to full (average) | 0.465 |
| AVG daily total Occupancy | 0.647 |

Table 6: LOWEST OCCUPANCY ARRIVAL-BASED

4.4 Not allowing mixing container types in a single yardblock

The last discussed scenario involves a rule where MIX yardblocks can only serve containers of a single flow type. This means that ones a container arrives and takes place in a mix type yardblock, only containers with the same type can be added to this yardblock.

BESCHRIJVEN RESULTATEN...

5 Performance

zeggen python suckt Average time per simulation: 127.2401417116324 seconds

| Containers Rejected | 562005.908 |
|---|----------------|
| CG Rejected | 4285.208 |
| Normal Rejected | 10305.508 |
| Reefer Rejected | 551700.4 |
| Total Travel Distance | 5329012083.215 |
| AVG Travel Distance Containers | 1757.727 |
| Portion of YB close to full (at some point) | 0.679 |
| Portion of YB never used | 0.176 |
| Portion of YB close to full (average) | 0.679 |
| AVG daily total Occupancy | 0.748 |

Table 7: MIXED RULE ARRIVAL-BASED

| Containers Rejected | 562459.5 |
|---|----------------|
| CG Rejected | 4311.817 |
| Normal Rejected | 12785.225 |
| Reefer Rejected | 549674.275 |
| Total Travel Distance | 6606445719.566 |
| AVG Travel Distance Containers | 2180.617 |
| Portion of YB close to full (at some point) | 0.648 |
| Portion of YB never used | 0.044 |
| Portion of YB close to full (average) | 0.648 |
| AVG daily total Occupancy | 0.842 |

Table 8: MIXED RULE DEPARTURE-BASED

| Containers Rejected | 557756.75 |
|---|---------------|
| CG Rejected | 4226.058 |
| Normal Rejected | 9384.333 |
| Reefer Rejected | 548372.417 |
| Total Travel Distance | 5823224027.74 |
| AVG Travel Distance Containers | 1922.426 |
| Portion of YB close to full (at some point) | 0.61 |
| Portion of YB never used | 0.245 |
| Portion of YB close to full (average) | 0.61 |
| AVG daily total Occupancy | 0.678 |

Table 9: MIXED RULE ARRIVAL-BASED DEPARTURE-BASED