# The treatment of optimizing container transportation dynamic programming and planning

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**Abstract.** The article addresses the treatment of applying the method of dynamic linear programming to solve the task of choosing the optimal strategy for the containers dispatch, taking into account the significant unevenness of loading and shipment of containers. The optimizing container transportation dynamic planning could be treated as mathematical model of the dynamic multi-period task of the loaded containers shipment, which allows the choice of the optimal strategy for sending containers, taking into account the significant unevenness of their loading and dispatch from the railway freight station. The efficiency of considered method is proved by numerical calculation being presented to disclose the dynamic linear programming algorithm implementing to solve the problem.

# 1 Introduction

The scientific task covers the development of conceptual approach for the optimizing container transportation dynamic planning which could be treated as dynamic multi-period task of the loaded containers shipment. Being treated as mathematical model of the optimizing container transportation the suggested economical model allows the choice of the optimal strategy for sending containers. One should take into account the significant unevenness of their loading and dispatch from the railway freight station.

The models of dynamic and stochastic programming have become widely used in planning operations over the past thirty years in management of supply chains [1]. The analysis of the famous works [2-7] shows that decision trees and the planning of scenarios based on their analysis are the main tools in the management of uncertainty and risk in math programming models. It should be noted that optimization models and, in particular, dynamic and stochastic programming models [8-12] are used for solving tasks of optimization of logistic network, reserves management and transportation routing. Some

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authors examine the theoretical aspects of logistics and optimizing transportation models [13-15]. However, the use of these models in logistics is still insufficient.

The first part of the article contained informative and math statement of dynamic multiperiod task of shipment of loaded containers which allows taking into consideration possible changes in supply amounts over planning periods as well as possible unevenness of cargo shipment (its delay) from railroad goods depot. Let's consider the numerical example of task solving.

## 2 Materials and Methods

The researching method involves the complex of a dynamic programming procedures for solving the problems of container transportation of goods. Container cargos could be shipped to the consumers according to the following scheme:

- loaded containers are transported to the container site of the railway freight station;

- containers are put on a temporary storage warehouse (TSW);

- containers are idle on the TSW till the customs clearance is finished in the export regime and until loaded on the railway platform, idle period is 3 days on average;

- then the containers are shipped by railway to the destination (port).

Let Us assume the following optimizing container transportation task. There are three alternative options for loading or stuffing containers:

1) on the floor with its subsequent loading on the vehicle by means of a crane;

2) on the floor with its subsequent loading on the vehicle by means of jacks;

3) without removing the container from the vehicle.

The advantage of loading containers on the floor is that this scheme of loading reduces the cost of storage of the loaded containers on the TSW in anticipation of the formation of wagons. Disadvantages: the use of lifting equipment is limited by the space of the warehouse (low ceiling and lack of space for stacking of loaded containers); capital investments are required for purchasing of lifting equipment. The cost of road transport depends on several factors. First, on the type of containers that are used. There are two options: the use of 20 foot containers with a capacity of 21.5 tons or 40 foot containers with a capacity of 27.5 tons. Secondly, on transport that is used for the shipment, weather it is owned or rented. Thus, it is required to organize the delivery of the loaded containers to the container site of the containers and two options of the use of vehicles lead to 12 options for containers shipment from the plant to the container site of the railway freight station, which differ in terms of costs:

1. Dispatch of cargos in 20-foot containers:

Own transport with loading:

- on the floor using a crane or jacks;

- into the vehicle;

Third-party vehicles with loading:

- on the floor using a crane or jacks;

- into the vehicle.

2. Dispatch of goods in 40 - foot containers:

Own transport with loading:

- on the floor using a crane or jacks;

- into the vehicle.

Third-party vehicles with loading:

- on the floor using a crane or jacks;

- into the vehicle.

Ошибка! Источник ссылки не найден. presents the calculation of the cost of a loaded container shipment.

				20 feet c	ontainer	•		40 feet container							
		own transport loading			third	-party ve	hicles	01	vn transpo	ort	third-party vehicles				
Indicators	Meas.				loading				loading		loading				
	units	on the floor using		into the	on the floor using		into the	on the floor using		into the	on the floor using		into the		
		crane	jacks	vehilce	crane	jacks	vehilce	crane	jacks	vehilce	crane	jacks	vehilc e		
1 Average route time	hour	1.33	1.33	1.33	2.33	2.33	2.33	1.33	1.33	1.33	2.33	2.33	2.33		
2. The cost of 1															
vehicle hour	Rub.	188.5	188.5	188.5	329.0	329.0	329.0	188.5	188.5	188.5	329.0	329.0	329.0		
<ol><li>The amount of costs of road transport</li></ol>	Rub.	250.7	250.7	250.7	766.5	766.5	766.5	250.7	250.7	250.7	766.5	766.5	766.5		
4. The length of the					,						,				
route	km	16.0	16.0	16.0	16.0	16.0	16.0	16.0	16.0	16.0	16.0	16.0	16.0		
5. The cost of cargo	Rub.														
freight station		5811.7	5811.7	6805.7	5811.7	5811.7	6805.7	6674.6	6674.6	7668.6	6674.6	6674.6	7668.6		
5.1. Storage of empty	Rub.														
containers		4176.0	4176.,0	4176.0	4176.0	4176.0	4176.0	4176.0	4176.0	4176.0	4176.0	4176.0	4176.0		
5.2. Storage of loaded	Rub.														
containers		496.0	496.0	1490.0	496.0	496.0	1490.0	496.0	496.0	1490.0	496.0	496.0	1490.0		
5.3. Fee for untimely	Rub.														
cargo provision before the appointed time of															
loading		628.7	628.7	628.7	628.7	628.7	628.7	911.6	911.6	911.6	911.6	911.6	911.6		
5.4. Loading and.	Rub.	020.7	028.7	028.7	020.7	020.7	028.7	911.0	911.0	911.0	911.0	911.0	911.0		
unloading operations	Ruo.	511.0	511.0	511.0	511.0	511.0	511.0	1091.0	1091.0	1091.0	1091.0	1091.0	1091.0		
	Rub.														
6. Depreciation charges		531.0	208.77		531.0	208.8		1216.2	804.0	536.9	679.2	267.0			
	Rub.														
6.1. Lifting equipment	<b>D</b> 1	531.0	208.77		531.0	208.8		679.2	267.0		679.2	267.0			
6.2. Road transport	Rub.							526.0	526.0	526.0					
equipment	Rub.		6271.1					536.9	536.9	536.9		7708.1			
7. Total costs	KUD.	6593.4	02/1.1	7056.4	7109.2	6786.9	7572.2	8141.4	7729.2	8456.2	8120.3	1/08.1	8435.1		
8. Weight of cargo															
(gross) in the container	t	21.5	21.5	21.5	21.5	21.5	21.5	27.5	27.5	27.5	27.5	27.5	27.5		
9. Costs per ton of															
cargo	Rub.	306.7	291.7	328.2	330.7	315.7	352.2	296.1	281.1	307.5	295.3	280.3	306.7		

Table 1. Calculation of costs for shipment of loaded containers

Analysis of the data presented in Ошибка! Источник ссылки не найден., shows, first, that the cost of shipment of loaded containers (line 7) is composed by three components: the costs for road transport (line 3), the cost of freight commodity station (line 5) and depreciation charges for lifting equipment and vehicles (line 6). Secondly, the shipment of goods by 40 - foot containers is cheaper than by 20-foot containers calculated per 1 ton of cargo (line 9). Third, the cost of shipment of loaded containers by owned vehicles is lower only for 20-foot containers. Transportation of 40-foot containers by own vehicles will be more expensive, because for this purpose new purchased semi-trailerscontainer carriers are used, and, accordingly, depreciation is accrued. It should be noted here that for the own vehicles intended for transportation of 20-foot containers, depreciation is not charged due to its full wear and tear. Analyzing the data presented in **Ошибка!** Источник ссылки не найден., it can also be concluded that the most profitable way to send 20-foot containers is to send own vehicles- with stuffing on the floor and further loading using jacks, and 40-foot containers - shipment by third-party vehicles with stuffing on the floor and loading using jacks (the costs corresponding to these options for containers shipment are highlighted in the Ошибка! Источник ссылки не найден.).

Thus, if additional restrictions apply to the shipment of the containers, the least costly options should be used. In the problem under consideration, additional restrictions can be imposed on the number of containers that are loaded on the floor and, accordingly, must be loaded on vehicles using a crane or jacks, as well as on the number of goods that must be sent by 20 and 40 foot containers. In addition, in this task it is necessary to take into account the uneven dispatch of products from the railway freight station and to minimize

the costs associated with untimely cargo provision before the appointed time of loading. Since human logic often comes to a standstill when solving complex problems, when the required variables are subject to a large number of restrictions, it is advisable to build a mathematical model of the problem and get the optimal solution.

#### 3 Results

Let's assume that the volume of the delivery of container cargoes  $Q_0$  is 1500 tons per month. Loading of containers at the plant is performed unevenly:  $Q_1^* = 600$  ton in the first week of each month,  $Q_2^* = 400$  ton in the second week,  $Q_3^* = 300$  ton in the third week while in the fourth week  $Q_{4}^{*} = 200$  ton. The shipment of containers from goods depot should be performed evenly,  $Q_t = 375$  ton,  $t = \{1, 2, 3, 4\}$ . Moreover, the amount of shipped goods packed in twenty-foot containers should be no less than: 300 ton during the first week ( $Q_{1,1} = 300$  ton), 200 ton during the second week ( $Q_{1,2} = 200$  ton), 150 ton during the third week ( $Q_{1,3} = 150$  ton) and 100 ton during the fourth week ( $Q_{1,4} = 100$  ton). If fact, this requirement is often violated due to delay of shipment from the depot for a duration of seven days or one week. Let's consider the following scenarios.

1) Scenario 1 (basic): we assume that there have been no breakouts in the shipment of containers from goods deport in the whole planning period  $t \in \{1, ..., T\}$ .

2) Scenario 2, in which  $y_{i,j,t} = 0, \forall i, j, t = 1$  and, respectively,  $Q_{i,t} = 0, \forall i, t = 1$  - i.e. trains with container cargoes have not been dispatched from goods depot during the 1st week. Let's assume that the delay of dispatch of the train with container goods is 7 days long, and cargoes should be therefore shipped within 2<sup>nd</sup> week.

3) Scenario 3, in which  $y_{i,i,t} = 0, \forall i, j, t = 2$  and, respectively,  $Q_{i,t} = 0, \forall i, t = 2$  - i.e. trains with container cargoes have not been dispatched from goods depot during the 2st week. Let's assume that the delay of dispatch of the train with container goods is 7 days long, and cargoes should be therefore shipped within 3<sup>rd</sup> week.

4) Scenario 4, in which  $y_{i,j,t} = 0, \forall i, j, t = 3$  and, respectively,  $Q_{i,t} = 0, \forall i, t = 3$  - i.e. trains with container cargoes have not been dispatched from goods depot during the 3rd week. Let's assume that the delay of dispatch of the train with container goods is 7 days long, and cargoes should be therefore shipped within 4<sup>th</sup> week.

The shipment of container cargoes is a subject of extra limitations. The number of containers ready for weekly shipment with ground container packing and its further loading onto container chassis by means of the crane or jacks is 5 pcs for any proposed loading approach. Plant warehouse is capable to hold no more than 20 twenty-feet containers and no more than 10 forty-feet ones. To find the solution one should calculate optimal percentage of loaded containers  $x_{i,i,t}$ , the percentage of shipped ones  $y_{i,i,t}$  and the percentage of those transferred for storage  $d_{i,j,t}$  at which common delivery costs would reach their minimum. The numerical result of proposed task is possible to obtain through Excel add-on, as this work implies processing of large-size data package. The search of solutions is performed with Analytic Solver Platform add-on. Solution results for this task

upon Scenario 1(basic) are represented in Ошибка! Источник ссылки не найден..

		twenty-feet container						forty-feet container						
		Owner's truck Third-party truck						Owner's truck Third-party truck						
		Packaging			I	Packaging	ş	Packaging			F	ackagin	g	tal
Parameters	U.o.m.	On-ground, w/use of		Onto the	On-ground, w/use of		Onto the	On-groun	d, w/use of	Onto the	On-ground, w/use of		Onto the	Total
		the crane	jacks	truck	the crane	jacks	truck	the crane	jacks	truck	the crane	jacks	truck	
Week 1														
1. Costs per 1 container	rub.	6593.4	6271 .1	7056.4	7109.2	6786.9	7572.2	8141.4	7729.2	8456. 2	8120.3	7708.1	8435.1	
2. Fee for presentation of goods prior to fixed time		628.7	628. 7		628.7	628.7		911.6	911.6		911.6	911.6		
3. Containered cargo weight (gross)	ton	21.5	21.5	21.5	21.5	21.5	21.5	27.5	27.5	27.5	27.5	27.5	27.5	
4. Number of packed containers	pcs	7	10	5	0	0	0	0	0	2	0	3	0	27
5. Number of shipped containers	pcs	5	5	5	0	0	0	0	0	2	0	0	0	17
6. Number of warehoused twenty-feet containers at the beginning of the period	pcs	0	0	0	0	0	0							0
7. Number of warehoused forty-feet containers at the beginning of the period	pcs							0	0	0	0	0	0	0
8. Number of warehoused twenty-feet containers at the end of the period	pcs	2	5	0	0	0	0							7
9. Number of warehoused forty-feet containers at the end of the period	pcs							0	0	0	0	3	0	3
10. Cargoes loaded	ton	150.5	215	107.5	0	0	0	0	0	55	0	82.5	0	610. 5
11. Cargoes shipped	ton	107.5	107. 5	107.5	0	0	0	0	0	55	0	0	0	377. 5
Weekly costs	rub.	109381									Shipped goods, in total		in total	377. 5
						Week 2	!							
1. Costs per 1 container	rub.	6593.4	6271 .1	7056.4	7109.2	6786.9	7572.2	8141.4	7729.2	8456. 2	8120.3	770 8.1	843 5.1	
2. Fee for presentation of goods prior to fixed time		628.7	628. 7		628.7	628.7		911.6	911.6		911.6	911. 6		
3. Containered cargo weight (gross)	ton	21.5	21.5	21.5	21.5	21.5	21.5	27.5	27.5	27.5	27.5	27.5	27.5	
4. Number of packed containers	pcs	7	3	0	1	0	0	0	0	6	0	0	0	17
5. Number of shipped containers	pcs	4	5	0	1	0	0	0	0	6	0	0	0	16
6. Number of warehoused twenty-feet containers at the beginning of the period	pcs	2	5	0	0	0	0							7
7. Number of warehoused forty-feet containers at the beginning of the period	pcs							0	0	0	0	3	0	3
8. Number of warehoused twenty-feet containers at the end of the period	pcs	5	3	0	0	0	0							8
9. Number of warehoused forty-feet containers at the end of the period	pcs							0	0	0	0	3	0	3
10. Cargoes loaded	ton	150.5	64.5	0	21.5	0	0	0	0	165	0	0	0	401. 5
11. Cargoes shipped	ton	86	107.	0	21.5	0	0	0	0	165	0	0	0	380

 Table 2. The result of solution of the task of shipment of packed containers (Scenario 1)

			5											
Weekly costs	rub.	107811									Shippe	d goods,	in total	380
			(271			Week 3		1		0450	1	770	843	1
1. Costs per 1 container	rub.	6593.4	6271 .1	7056.4	7109.2	6786.9	7572.2	8141.4	7729.2	8456. 2	8120.3	770 8.1	843 5.1	
2. Fee for presentation of goods prior to fixed time		628.7	628. 7		628.7	628.7		911.6	911.6		911.6	911. 6		
3. Containered cargo weight (gross)	ton	21.5	21.5	21.5	21.5	21.5	21.5	27.5	27.5	27.5	27.5	27.5	27.5	
4. Number of packed containers	pcs	2	3	0	0	0	0	0	0	0	0	1	6	12
5. Number of shipped containers	pcs	5	5	0	0	0	0	0	0	0	0	0	6	16
6. Number of warehoused twenty-feet containers at the beginning of the period	pcs	5	3	0	0	0	0							8
7. Number of warehoused forty-feet containers at the beginning of the period	pcs							0	0	0	0	3	0	3
8. Number of warehoused twenty-feet containers at the end of the period	pcs	2	1	0	0	0	0							3
9. Number of warehoused forty-feet containers at the end of the period	pcs							0	0	0	0	4	0	4
10. Cargoes loaded	ton	43	64.5	0	0	0	0	0	0	0	0	27.5	165	300
11. Cargoes shipped	ton	107.5	107. 5	0	0	0	0	0	0	0	0	0	165	380
Weekly costs	rub.	109400									Shippe	ed goods,	in total	380
				-	-	Week 4	-	1		r –			1	r –
1. Costs per 1 container	rub.	6593.4	627 1.1	7056.4	7109.2	6786.9	7572.2	8141.4	7729.2	8456 .2	8120.3	770 8.1	843 5.1	
2. Fee for presentation of goods prior to fixed time		628.7	628. 7		628.7	628.7		911.6	911.6		911.6	911 .6		
<ol> <li>Containered cargo weight (gross)</li> </ol>	ton	21.5	21.5	21.5	21.5	21.5	21.5	27.5	27.5	27.5	27.5	27. 5	27. 5	
4. Number of packed containers	pcs	3	0	0	0	0	0	0	0	0	0	0	5	8
5. Number of shipped containers	pcs	5	1	0	0	0	0	0	0	0	0	4	5	15
6. Number of warehoused twenty-feet containers at the beginning of the period	pcs	2	1	0	0	0	0							3
7. Number of warehoused forty-feet containers at the beginning of the period	pcs							0	0	0	0	4	0	4
<ol> <li>Number of warehoused twenty-feet containers at the end of the period</li> </ol>	pcs	0	0	0	0	0	0							0
9. Number of warehoused forty-feet containers at the end of the period	pcs							0	0	0	0	0	0	0
10. Cargoes loaded	ton	64.5	0	0	0	0	0	0	0	0	0	0	137 .5	202
11. Cargoes shipped	ton	107.5	21.5	0	0	0	0	0	0	0	0	110	137 .5	376. 5
Weekly costs	rub.	112245									Shippe	d goods,	in total	376. 5
					In to	tal, for 4	weeks			-				
1. Packed containers, in total	pcs	19	16	5	1	0	0	0	0	8	0	4	11	64
2. Shipped containers, in total	pcs	19	16	5	1	0	0	0	0	8	0	4	11	64
3. Warehoused twenty- feet containers, in total	pcs	5	5	0	0	0	0							10
4. Warehoused forty-feet containers, in total	pcs							0	0	0	0	4	0	4
5. Loaded cargoes, in total	ton	408.5	344	107.5	21.5	0	0	0	0	220	0	110	302	151

													.5	4
6. Shipped cargoes, in total	ton	408.5	344	107.5	21.5	0	0	0	0	220	0	110	302 .5	151 4
Total costs for 4-week period	rub.	4388398												

The analysis of solutions found upon all four scenarios is reviewed through the structure of container shipment represented in Ошибка! Источник ссылки не найден..

D. I.	×.	Values for the scenario									
Parameters	U.o.m.	Scenario 1	Scenario 2	Scenario 3	Scenario 4						
Total number of containers shipped, incl.:	pcs	64	64	64	64						
twenty-feet containers with on-ground packing and crane loading	pcs	20	11	17	20						
forty-feet containers with on-ground packing and crane loading	pcs	0	4	1	0						
Total number of containers shipped with on-ground packing and crane loading	pcs	20	15	18	20						
twenty-feet containers with on-ground packing and jack loading	pcs	16	12	13	16						
forty-feet containers with on-ground packing and jack loading	pcs	4	3	6	4						
Total number of containers shipped with on-ground packing and jack loading	pcs	20	15	19	20						
twenty-feet containers with truck packaging	pcs	5	18	11	5						
forty-feet containers with truck packaging	pcs	19	16	16	19						
Total number of containers with truck packaging	pcs	24	34	27	24						
Total number of twenty-feet container shipped	pcs	41	41	41	41						
Total number of forty-feet containers shipped	pcs	23	23	23	23						
Number of container packaging ways used	pcs	7	8	8	7						
Total costs	Thousand rubles	438.8	436.4	433.3	432.6						
Increase (+) / Reduction (-) of total costs comparing with Scenario 1	%	-	-0.55%	-1.27%	-1.43%						

Table 3. The analysis of use of different types of containers

# 4 Discussion

The analysis according to Scenario 1 (basic) shows that, firstly, it will be required 64 containers to dispatch 1500 ton of container cargoes within a month – 41 pcs of twenty-feet containers and 23 pcs of forty-feet ones, among others. Secondly, the optimal decision implies the use 7 of 12 possible ways of container shipment. Only two ways of shipment of twenty-feet containers (by trucks belonging to some third party with ground container packing and its further loading onto the truck with the use of jacks or container packaging without its unloading from the truck) and three ways of shipment of forty-feet containers

(by owner's trucks with ground container packing and its further loading onto the truck with the use of the crane and jacks as well as by third-party trucks container packaging with ground container packing and its further loading onto the truck with the use of the crane). In this case, total cost of container shipment during four-week period is to be 438.8 thousand rubles.

Thirdly, the analysis of use of containers of different types (see Table 3) shows that the following ways of loading are used:

- on-ground loading with the use of the crane - twenty containers, including 19 twenty-feet ones and no forty-feet ones.

- on-ground loading with the use of jacks - 20 containers, including 16 twenty-feet ones and 4 forty-feet ones.

- loading onto the truck - 24 containers, including 5 twenty-feet ones and 19 twenty-feet ones.

Fourthly, conspicuous is the fact that the total number of warehoused twenty-feet containers is 10 pcs while the number of forty-feet ones is 4 pcs which is far less than the storage capacity which is limited by 20 pcs for twenty-feet containers and 10 pcs for forty-feet ones. It is obvious that this number of warehoused containers is enough to amend the unevenness of their shipment to consumers from railroad goods depot.

The analysis of scenarios No. 2 - 4, referring to the situation when the shipment of containers from the depot is delayed shows that, firstly, in all the cases, it will be required 64 container monthly to ship 1500 tons of containered goods, including 41 twenty-feet one and 23 forty-feet ones; but, each scenario assumes its own ways of container loading. Secondly, costs are reduced comparing with the basic variant: according to Scenario 2, the amount of reduction is 0.55%, according to Scenario 3 it is to be 1.27% and, according to Scenario 4, it is to be 1.43%. The reduction of costs is due to easing of limitations in this task. First of all, the limitation of the amount of goods to be shipped from the depot within a week is a subject of such easing. It is obvious that due to shipment delay within a week the initial limitation (Qt = 375 T, t = {1, 2, 3, 4}) can't be honored. The number of containers shipped within a week, loaded from the ground or with the use of the crane is also the subject of limitation easing as well as the number of containers shipped within a week, loaded from the ground or that this task has no solution, if the easing of this limitation is not implied.

## 5 Conclusion

The researching results prove that in case of breakouts (delays of container shipment from the railroad goods depot for one week) the reserve of loading capacity will be insufficient. Possible ways of solving this problem are the use of extra work or purchasing some additional equipment (a crane, jacks) for loading containers onto container chassis.

The analyzed example which is rather complicated one and based on real data shows that the analysis of costs does not always enable to make the right decision on ways of container shipment. Models of line programming which are powerful supporting tools in adopting managerial decisions should be used more actively by the managers. Here, we offer the dynamic multi-period task model of shipment of loaded containers allowing choosing optimal shipment strategy with allowances made for sufficient loading unevenness and breakouts of shipment from the railroad goods deport. The numerical solution is represented which confirms that the meth-od of dynamic linear programming can be successfully used to solve the problem of choice of the optimal shipment strategy under the conditions of sufficient unevenness of their loading and shipment.

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