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DETERMINATION OF DISTRIBUTION HUB OPERATING STRATEGY AS IP MODEL A CASE STUDY IN OIL AND GAS INDUSTRY

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ABSTRACT

Supply chain is considered as one of the key areas of companies' success and it should be designed appropriately to be compatible with companies' objectives and strategies. In this paper, a case study of supply chain network redesign in oil and gas industry will be thoroughly studied, analyzed and concluded. This research has been applied and deployed on an oil and gas local company called "X-LUBE". In this study; an integer linear programing (ILP) optimization model is built and solved to determine the most cost efficient operating strategy for X-LUBE company distribution hub. Also, relevant sensitivity analysis is conducted on resulted optimal strategy.

KEYWORDS: Integer Programing (IP), Distribution Network Design (DND), Operations Research (OR), Distribution Strategy, Sensitivity Analysis, 3rd Party Logistics (3PL) Outsourcing

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1. INTRODUCTION & BACKGROUND

Saudi Arabia is one of the most active and promising lubricants markets worldwide [1] and hence there are many lubricants providers available, one of these is X-LUBE. It is an international oil and gas company that supplies wide range of industrial and automotive lubricants for various sectors across kingdom of Saudi Arabia. X-LUBE contributes to almost 10% of Saudi Arabia annual business volume, which is equivalent to fifty (50) million liters.

X-LUBE sells its products in two main sectors; B2C (Business-to-Customers) and B2B (Business-to-Business). In Saudi Arabia, there are six sales and storage sites where X-LUBE is using to distribute its products across all Saudi Arabia geographical regions. These six sites are 3, 4,5,6,7 and 8. All are being supplied from a plant located in the industrial city Yanbu (next to local base oil factory) [2]. X-LUBE has decided to operate a distribution HUB in Yanbu also next to the plant.

This distribution hub has three main operating strategies;

Strategy I: use of hub as exclusive in-transient storage: all plant stock to be sent to hub and shipped to X-LUBE sites from that hub; no direct shipment from plant.

Strategy II: manage direct shipment to X-LUBE sites from plant and use hub for stock build up

Strategy III: mixed strategy; agreed setup with defined criteria where direct shipment from plant and stock build up in hub to be used

The paper is trying to address the following research questions for X-LUBE,

1. What is the best operating strategy of the distribution HUB?

2. How X-LUBE company distribution network must be designed in order to optimize overall supply chain flow and cost?

3. What is the best network model to be used in X-LUBE network?

The main assumptions of this study are listed in points below;

1. The demand plan is assumed to be deterministic with a finite uncertainty levels of $\pm 15\%$

2. The in-plant warehouse is mainly for in-bound logistics activities; i.e. raw and packing material storage where finished goods storage is very minimal.

3. Operating stand-alone distribution hub/ warehouse is not allowed in the plant and has to be located nearby the plant industrial area.

4. Holding cost is ignored since distribution hub operating cost is assumed to be the same in all operating strategies.

- 5. Single delivery point in each city is assumed, [5]
- 6. Transportation cost between any two demand points is the same regardless of direction

 $C_{ij} = C_{ji}$.

2. RELEVANT DATA ANALYSIS

All input data related to the distribution network and model parameters will be gathered, analysed and determined in a precise and structured way of calculation. The primary figures needed to build the model are;

- 1- Distribution Transportation Costs
- 2- Supply and Demand Volume Data

Distribution Transportation Costs: the objective of this part is to come up the transportation cost per distance unit traveled from one location to another. This is the "Total Cost per Distance Unit" in Saudi Riyal (SR). Total Cost per Distance Unit is calculated as per the below split;

- Cost of Consumables (Fuel and Oil)

- Cost of Vehicle Operations (Drivers, Insurance ... etc.)

As per relevant figures and calculations, the unit transportation comes to be SR 0.8 per kilometer. This will be the basis of distance-cost conversion between demand points within the distribution network.

Supply and Demand Volume Data: this part concerns about converting the volume data in both supply and demand nodes into umber of delivery trips, which is the "Volume-Delivery Conversion Factor". This figure can be calculated by finding the maximum volume load per each product type then to calculate the average volume per trip to convert each supply and demand associated volume in the model to its number of trips.

Table 1: Volume-Delivery Conversion Factor Calculation

Type	Linit Volumo Litoro	Flat Bed Trailer				
Туре	Unit Volume-Liters	Flat Bed Trailer Max Load-Units Max Volu 810 19 100 20 ume - Liters 20 lume - Tons 2	Max Volume Liters			
Cartons	24 × 1 L	810	19440			
Drums	208 L	100	20800			
	Average Volume	- Liters	20120			
	Average Volume	20				

Table 1 shows the "Volume-Delivery Conversion Factor" calculation approach.

Total X-LUBE supply and demand volume data (in Million Liters-MLTR) along with regional allocated demand data can be summarized in table 2. The expected number of trips is also determined using "Volume-Delivery Conversion Factor", which is 20 tons / trip.

		Table 2. Sup	pry and Demand Volume	and Denvery Trips Spit	
	Cities	Volume %	Total Annual Volume –MLTR	Allocated Volume-MLTR	No. of Truck Loads
	3	30%		15	D ₃ =750
pui	4	20%		10	D ₄ =500
ems	5	20%	50	10	D ₅ =500
Ω	õ 6 10%	50	5	D ₆ =250	
7 10%		5	D ₇ =250		
	8	10%		5	D ₈ =250
	1				7
pply	Plant	Volume%	Total Annual Volume - MLTR	Allocated Volume-Liters	No. of Truck Loads
Su	Yanbu	100%	50	50	X _M =2500

Table 2. Supply and Domand Volume and Dolivery Tring Solit

3. METHODOLOGY APPROACH

In spite of several existing optimization methods for such problem like simulation [3], Principal Components Analysis (PCA) [6] and Improved Particle Swarm Optimization Algorithm [9], Integer Programing (IP) is a the most common approach in DND problems [4], each strategy will be formulated as a cost minimization IP model with governing constraints and certain assumptions, taking into consideration the fact that the plant cannot accommodate such distribution hub as in-plant warehouse.

3.1 Distribution Hub Operating Strategy IP Model Structure Below are the elements and structure of operating strategy IP model;

Objective Function

The model objective's function is to minimize total transportation cost to satisfy customers' demand in the distribution network

Decision Variables

The IP model decision variables are listed below in the format of X_{ij} which represents trips from source (i) to destination (j) where;

1=Plant (Supply Node), 2=Hub (Supply Node),

3=Demand Node No. 3, 4=Demand Node No. 4, 5=Demand Node No. 5,

6=Demand Node No. 6, 7= Demand Node No. 7, 8=Demand Node No. 8

Input Data

Input data to the IP model is composed of several types of figures listed below;

1- Transportation costs represented by notation C_{ij} , transportation cost per trip from source (i) to destination (j)

With reference to appendix 1 in which the transportation cost is calculated between possible source and destination combinations; Table 3 below shows the input figures to be used in the model formulation.

	Table 5. Distribution frub Operating Woder Input (Transportation Costs)											
Cij	1	2	3	4	5	6	7	8				
1		500	480	1080	1400	1040	800	720				
2	500		280	880	1200	840	600	520				
3	480	280		760	1080	520	680	840				
4	1080	880	760		360	880	280	1040				
5	1400	1200	1080	360		1200	600	1400				
6	1040	840	520	880	1200		1200	1320				
7	800	600	680	280	600	1200		800				
8	720	520	840	1040	1400	1320	800					

Table 3. Distribution Hub Operating Model Input (Transportation Costs)

- 2- Supply and Demand Data which is mainly shown in table 2
- Total Demand Volume Trips X_M

$$X_M$$
 = Total Demand Trips = $\left(\frac{50,000,000 \text{ LTR}}{20,000 \text{ LTR/Trip}}\right)$ = 2500 trips

- Regional Demand Volume Trips

 $D_3 = 750$, $D_4 = 500$, $D_5 = 500$, $D_6 = 250$, $D_7 = 250$, $D_8 = 250$ where D_i is the demand at demand node *i* (measured by load trips)

3.2 Strategy I: In-Transient Storage Hub

This is a pure push strategy in which the produced stock is sent to the hub and prepared there for shipment to demand locations. This strategy allows the plant to focus mainly on in-bound logistics and utilizes the available resources on production-related activities. Also; the space of finished goods storage will be very minimal in which staging, rework or hold is needed. On the other hand; this strategy will not by suitable if volume is not enough to justify the high associated operating cost. Figure 1 below shows this strategy graphically.



Figure 1: X-LUBE Distribution Hub Strategy I

Strategy I Assumption can be summarized in the below points;

- 1- The demand is high and steady in volume and assumed to cover the large operating transportation and storage cost
- 2- The cost of one way trip from plant to distribution hub is SR 500
- 3- Deliveries can occur between any two demand points within the network

Objective Function

Minimize Total Monthly Transportation Cost (TC) $TC = C_{12}X_{12} + \sum_{j=3}^{8} C_{2j}X_{2j} + \sum_{k=3}^{8} \sum_{j=3, j \neq k}^{8} C_{kj}X_{kj}$

Constraints

- The first constraint is to ensure minimum hub supply of 2500 trips

$$\sum_{i=3}^{8} X_{2i} \ge 2500$$

- The second constraint is about managing supply-demand at each demand point. At each demand point, stock supplied will be at least equal to the demand of that point or more. If supplies exceed demand, surplus stock will be transferred to other demand locations via exiting demand point.

$$X_{2i} \ge \sum_{j=1, j \neq k}^{8} X_{kj}$$
 k=3, 4, 5,6,7,8

- The third constraint is to balance Supply-Demand at demand points. At each demand point, there is stock received (input) and stock transferred (out). The difference between stock received and stock transferred out has to be exactly equal to the requirements of that demand point.

$$X_{2k} - \sum_{i=3, i \neq k}^{8} X_{ki} = D_k$$

- The last is the non-negativity constraint

 $X_{ij} \ge 0$

Strategy I LP Model

 $\begin{array}{l} \text{Minimize} & TC = 500 \, X_{12} + 280 \, X_{23} + 880 \, X_{24} + 1200 \, X_{25} + 840 \, X_{26} + 600 \, X_{27} + 520 \, X_{28} + 760 \, X_{34} + 1080 \, X_{35} + 520 \, X_{36} + \ 600 \, X_{37} + 840 \, X_{38} + 760 \, X_{43} + 360 \, X_{45} + \ 880 \, X_{46} + 280 \, X_{47} + 1040 \, X_{48} + 1080 \, X_{53} + 1080 \, X_{53} + 1080 \, X_{54} + 1080 \, X_{56} + 1080 \, X_{56}$

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 $\frac{360 \, X_{54} + 1200 \, X_{56} + \, 600 \, X_{57} + 1400 \, X_{58} + 520 \, X_{63} + 880 \, X_{64} + 1200 \, X_{65} + \, 1200 \, X_{67} + 1320 \, X_{68} + 680 \, X_{73} + 280 \, X_{74} + \, 600 \, X_{75} + \, 1200 \, X_{76} + \, 800 \, X_{78} + \, 840 \, X_{83} + \, 1040 \, X_{84} + \, 1400 \, X_{85} + \, 1320 \, X_{86} + \, 800 \, X_{87} + \, 1000 \, X_{87} + \, 1000 \, X_{88} +$

Subject to

 $\begin{array}{l} X_{23} + X_{24} + X_{25} + X_{26} + X_{27} + X_{28} \leq X_{12} \\ X_{34} + X_{35} + X_{36} + X_{37} + X_{38} \leq X_{23} \\ X_{43} + X_{45} + X_{46} + X_{47} + X_{48} \leq X_{24} \\ X_{53} + X_{54} + X_{56} + X_{57} + X_{58} \leq X_{25} \\ X_{63} + X_{64} + X_{65} + X_{67} + X_{68} \leq X_{26} \\ X_{73} + X_{74} + X_{75} + X_{76} + X_{78} + \leq X_{27} \\ X_{83} + X_{84} + X_{85} + X_{86} + X_{87} \leq X_{28} \\ X_{23} - X_{43} - X_{53} - X_{63} - X_{73} - X_{83} = 750 \\ X_{24} - X_{34} - X_{54} - X_{66} - X_{76} - X_{86} = 250 \\ X_{26} - X_{36} - X_{46} - X_{56} - X_{76} - X_{86} = 250 \\ X_{28} - X_{38} - X_{48} - X_{68} - X_{78} - X_{58} = 250 \\ X_{27} - X_{37} - X_{47} - X_{67} - X_{87} - X_{57} = 250 \\ X_{ij} \geq 0 \end{array}$

Using LINGO 18 to solve the above Model (1) results in following solution;

 $X_{12} = 2500, X_{23} = 750, X_{24} = 500, X_{25} = 500, X_{26} = 250, X_{27} = 250, X_{28} = 250$ Value of Objective Function = SR 2,990,000

Figure 2 below shows strategy I solution graphically



Figure 2: Graphical Presentation of Strategy I Solution

3.3 Strategy II: Exclusive Storage Hub

This strategy allows deliveries to be dispatched from plant only while utilizing the distribution hub as a storage facility. This strategy works perfectly when in-plant finished goods storage capacity is low (no enough space to store production output at plant) and back-load transportation is allowed (material supply trucks to be used to carry finished goods in their way back to demand points). This will increase the trucks utilization in the entire supply chain network; inbound and outbound. On the other hand; the main drawback of this strategy is the double handling of loads via shuttling operation between plant and distribution hub which results in extra transportation cost and high number of product touches which increase the damages rates in finished goods. Figure 3 provides a graphical representation of this strategy.

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Figure 3: X-LUBE Distribution Hub Strategy II

Strategy II Assumptions are briefed in the below points;

- 1- Deliveries to be sent only from the plant to demand points; no deliveries to occur from the distribution hub
- 2- Only main sites which are Jeddah, Riyadh and Dammam can send deliveries to other demand sites i.e. Khamis Mushait, Buridah and Tabuk.
- 3- Shuttling process is to be initiated between the plant and the distribution hub.
- 4- Capacity-to-Demand Ratio (C: D) is assumed to be 130% which means that the plant is capable of producing 30% over the average demand. This is due the capability buffer built in the plant at the design stage.
- 5- Average volume per pallet = 1000 Liters
- 6- Average Volume Per Trip = 20,000 Liters = 20 Tons
- 7- Produce-to-Demand (PtD) volume represents 40% of total X-LUBE demand of 50 million liters. Hence, 60% of plant production will be stored in the distribution hub till demand arises, then it will be shipped back to the plant for delivery to the requested demand points.
- 8- For the sake of control and capital investment optimization, deliveries are assumed to be sent via plant as crossdocking setup is available and proper control can be maintained.

 $1-PtD = (1-40\%) \times Supply = 60\% \times Supply$

Hub Stock = 60%(50,000,000) = 30,000,000 LTR ≈= 1,500 trips =31,500 pallets

9- All delivered volume from plant to hub is shipped back to plant when demand arises to send directly to demand points.

Table 4 below shows the average number of pallets to be carried in each trip; assuming flat-bed transportation trailer.

Table 4: Average Number of Pallets per Flat-Bed Trailer Trip

Tuno	Valuma 9/	Flat Bed				
Type	Volume % 70% 30% Average No. of Pallets P	Max Load-Units	No. of Pallets			
Cartons	70%	810 *	13			
Drums	30%	100**	8			
	Average No. of Pall	21				

* 45 cartons / pallet ** 4 drums / pallet

Objective Function

Minimize Total Monthly Transportation Cost (TC)

 $TC = 2(C_{12}X_{12}) + \sum_{j=3,4,5,6,7,8} C_{1j}X_{1j} + \sum_{k=3}^{5} \sum_{j=3,j\neq k}^{8} C_{kj}X_{kj}$

Constraints

- The first constraint is to ensure that plant supply covers all demand points requirements $\Sigma^8 = V > \Sigma^5 = \Sigma^8 = V$

 $\sum_{i=3}^{8} X_{1i} \ge \sum_{k=3}^{5} \sum_{j=3, j \neq k}^{8} X_{kj}$

- The second constraint is to balance supply and demand at each demand points

$$X_{1k} - \sum_{i=3, i \neq k}^{\circ} X_{ki} = D_k$$

- The third constraint confirms no demand requirements to be fulfilled directly from hub

 $X_{2k} = 0$ k=3, 4, 5,6,7,8

- The fourth constraint ensures no demand requirements to be fulfilled from non-primary sites, i.e. Khamis Mushait, Buridah or Tabuk

 $X_{ij} = 0$ for i=6,7,8, i \neq j

- The last is non-negativity constraint

$$X_{ij} \ge 0$$

Strategy II IP Model

 $\begin{array}{l} \text{Minimize } TC = 1000 \, X_{12} + 480 \, X_{13} + 1080 \, X_{14} + 1400 \, X_{15} + 1040 \, X_{16} + 800 \, X_{17} + 720 \, X_{18} + 760 \, X_{34} + \\ 1080 \, X_{35} + 520 \, X_{36} + 600 \, X_{37} + 840 \, X_{38} + 760 \, X_{43} + 360 \, X_{45} + 880 \, X_{46} + 280 \, X_{47} + 1040 \, X_{48} + 1080 \, X_{53} + \\ 360 \, X_{54} + 1200 \, X_{56} + 600 \, X_{57} + 1400 \, X_{58} \end{array}$

Subject to

 $\begin{array}{l} X_{12} = X_{21} \leq 1500; \\ X_{13} - X_{34} - X_{35} - X_{36} - X_{37} - X_{38} \geq 750 \\ X_{15} - X_{53} - X_{54} - X_{56} - X_{57} - X_{58} \geq 500 \\ X_{14} - X_{43} - X_{45} - X_{46} - X_{47} - X_{48} \geq 500 \\ X_{16} - X_{63} - X_{64} - X_{65} - X_{67} - X_{68} \geq 250 \\ X_{18} - X_{83} - X_{84} - X_{85} - X_{86} - X_{87} \geq 250 \\ X_{17} - X_{73} - X_{74} - X_{75} - X_{76} - X_{78} \geq 250 \\ X_{23} = X_{24=}X_{25} = X_{26} = X_{27} = X_{28} = 0 \\ X_{63} = X_{64} = X_{65} = X_{67} = X_{68} = 0 \\ X_{73} = X_{74} = X_{75} = X_{76} = X_{78} = 0 \\ X_{83} = X_{84} = X_{85} = X_{86} = X_{87} = 0 \\ X_{43} = X_{84} = X_{85} = X_{86} = X_{87} = 0 \\ X_{43} = X_{44} = X_{44} = X_{44} = X_{44} = X_{44} = 0 \\ X_{44} = X_{44} = X_{44} = X_{44} = X_{44} = 0 \\ X_{44} = X_{44} = X_{44} = X_{44} = 0 \\ X_{44} = X_{44} = X_{44} = X_{44} = X_{44} = 0 \\ X_{44} = X_{44} = X_{44} = X_{44} = 0 \\ X_{44} = X_{44} = X_{44} = X_{44} = 0 \\ X_{44} = X_{44} = X_{44} = X_{44} = 0 \\ X_{44} = X_{44} = X_{44} = X_{44} = 0 \\ X_{44} = X_{44} = X_{44} = X_{44} = 0 \\ X_{44} = X_{44} = X_{44} = X_{44} = X_{44} = 0 \\ X_{44} = X_{44} = X_{44} = X_{44} = X_{44} = X_{44} = 0 \\ X_{44} = X_{44} =$

Using LINGO 18 to solve the above Model (1) results in following solution;

 $X_{12} = 1500 \ X_{13} = 750, \ X_{14} = 500, \ X_{15} = 500, \ X_{16} = 250, X_{17} = 250, \ X_{18} = 250$

Value of Objective Function = **SR 3,740,000**

Figure 4 below shows strategy II solution graphically



Figure 4: Graphical Presentation of Strategy II Solution

3.4 Strategy III: Hybrid Distribution Strategy

This is a mix strategy where Full-Truck-Loads (FTL) stock is to be sent directly from plant to various demand points and customers while partial-orders demand is to be sent to the distribution hub for preparation and delivery. This strategy allows better resources utilization and flexibility in both in-plant warehouse as well as the distribution hub in spite of high required level of planning and coordination. Figure 5 graphically shows this strategy.

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Figure 5: X-LUBE Distribution Hub Strategy III

Strategy III Assumptions are listed below;

- 1- Sales Volume (Demand) is classified into two categories; Direct Demand and Indirect Demand. Direct demand is sent directly from plant to customers with no need to be stored to distribution hub while indirect demand is sent to distribution hub to preparation, handling and dispatching
- 2- Direct Demand represents 35% of total demand while indirect deliveries contributes to 65% of total demand as shown in appendix 2 related analysis.
- 3- FTL's deliveries can be sent directly to certain demand points or customers within the same region; no cost differences are assumed.
- 4- FLT deliveries are either orders to same customer or loads with one SKU.
- 5- No shuttling back to from the distribution hub to plant
- 6- Direct deliveries represents 35% of total volume trips (X_M) of 2500 $X_D = \sum_{j=3}^{8} X_{1j} = 35\% X_M = 875$
- 7- Indirect deliveries represents 65% of total volume trips (X_M) of 2500 $X_I = \sum_{j=3}^8 X_{2j} = 65\% X_M = 1625$

Objective Function

Minimize Total Monthly Transportation Cost (TC)

$$TC = C_{12}X_{12} + \sum_{j=3,4,5,6,7,8} C_{1j}X_{1j} + \sum_{j=3,4,5,6,7,8} C_{2j}X_{2j} + \sum_{k=3}^{6} \sum_{j=3,j\neq k}^{6} C_{kj}X_{kj}$$

Constraints

- The first constraint balances plant supply with direct volume fulfillment to demand points

$$\sum_{j=3}^{5} X_{1j} = X_D$$

- Similarly, the second constraint balances hub supply with indirect volume fulfillment to demand points

$$\sum_{j=3}^{n} X_{2j} = X_l$$

- The third constraint ensures that direct and indirect volume equals to total supply of 2500 trips $X_D + X_I = 2500$
- The fourth constraint is for supply-demand balancing. At each demand point, there is stock received (input from both plant and hub) and stock transferred (out). The difference between stock received and stock transferred out has to be at least equal to the requirements of that demand point

$$X_{1k} + X_{2k} - \sum_{i=3, i \neq k}^{8} X_{ki} \ge D_k$$

- The last is non-negativity constraint

$$X_{ij} \ge 0$$

Strategy III IP Model

 $\begin{array}{l} \text{Minimize } TC = 500 \, X_{12} + 480 \, X_{13} + 1080 \, X_{14} + +1040 \, X_{16} + 1400 \, X_{15} + 800 \, X_{17} + 720 \, X_{18} + 280 \, X_{23} + 880 \, X_{24} + 1200 \, X_{25} + 840 \, X_{26} + 600 \, X_{27} + 520 \, X_{28} + 760 \, X_{34} + 1080 \, X_{35} + 520 \, X_{36} + 600 \, X_{37} + 840 \, X_{38} + 760 \, X_{43} + 360 \, X_{45} + 880 \, X_{46} + 280 \, X_{47} + 1040 \, X_{48} + 1080 \, X_{53} + 360 \, X_{54} + 1200 \, X_{56} + 600 \, X_{57} + 1400 \, X_{58} + 520 \, X_{63} + 880 \, X_{64} + 1200 \, X_{65} + 1200 \, X_{67} + 1320 \, X_{68} + 680 \, X_{73} + 280 \, X_{74} + 600 \, X_{75} + 1200 \, X_{76} + 800 \, X_{78} + 840 \, X_{83} + 1040 \, X_{84} + 1400 \, X_{85} + 1320 \, X_{86} + 800 \, X_{87} \end{array}$

Subject to

 $\begin{array}{l} X_{13}+X_{14}+X_{15}+X_{16}+X_{17}+X_{18}\leq 875\\ X_{23}+X_{24}+X_{25}+X_{26}+X_{27}+X_{28}\leq 1625\\ X_{12}\geq 1625\\ X_{13}+X_{23}-X_{34}-X_{35}-X_{36}-X_{37}-X_{38}\geq 750\\ X_{14}+X_{24}-X_{43}-X_{45}-X_{46}-X_{47}-X_{48}\geq 500\\ X_{15}+X_{25}-X_{53}-X_{54}-X_{56}-X_{57}-X_{58}\geq 500\\ X_{16}+X_{26}-X_{63}-X_{64}-X_{65}-X_{67}-X_{68}\geq 250\\ X_{17}+X_{27}-X_{73}-X_{74}-X_{75}-X_{76}-X_{78}\geq 250\\ X_{18}+X_{28}-X_{83}-X_{84}-X_{85}-X_{86}-X_{87}\geq 250\\ X_{ij}\geq 0 \end{array}$

Using LINGO 18 to solve the above Model (3) results in following solution;

 $X_{12} = 1625 \ X_{13} = 375$, $X_{15} = 500$, $X_{23} = 375$, $X_{26} = 250$, $X_{27} = 250$, $X_{24} = 500$, $X_{28} = 250$

Value of Objective Function = SR 2,727,500

Figure 6 below shows strategy III solution graphically



Figure 6: Graphical Presentation of Strategy III Solution

In brief; here is the summary of the three available operating strategy of X-LUBE company distribution hub;

- I. Strategy I: In-Transient Storage Hub; Total Annual Cost= **SR 2,990,000**
- II. Strategy 2: Exclusive Storage Hub; Total Annual Cost= SR 3,740,000
- III. Strategy 3: Hybrid Distribution Strategy; Total Annual Cost= SR 2,727,500

4. Sensitivity Analysis for Best Strategy

Since strategy III is proven to be the best strategy as per IP model solution outcome, a sensitivity analysis is conducted to check the effect of certain factors on the model objective function value. The factors to be examined are; direct and indirect deliveries, transportation cost and business volume. In section A, direct and indirect deliveries split impact on objective function value will be discussed whereas section B discusses transportation cost and business.

A. Direct vs. Indirect Deliveries Impact on Optimal Solution

In this part, strategy III IP model is solved for different direct-indirect deliveries split combinations and results are shown in table 5;

<u> </u>	Table 5: Strategy III Direct/Indirect Deliveries Sensitivity Analysis									
Combination	Direct	Indirect	Total	Total Transportation Cost-SR						
1	0	100%	100%	2,000,000						
1	0	2500	2500	2,990,000						
2	5%	95%	100%	2 952 500						
2	125	2375	2500	2,352,300						
2	10%	90%	100%	2 015 000						
3	250	2250	2500	2,913,000						
1	15%	85%	100%	2 877 500						
7	375	2125	2500	2,877,500						
5	20%	80%	100%	2 840 000						
5	500	2000	2500	2,840,000						
6	25%	75%	100%	2 802 500						
0	625	1875	2500	2,802,300						
7	30%	70%	100%	2 765 000						
/	750	1750	2500	2,703,000						
o	35%	65%	100%	2 727 500						
0	875	1625	2500	2,727,500						
0	40%	60%	100%	2,600,000						
9	1000	1500	2500	2,090,000						
10	45%	55%	100%	2 652 500						
10	1125	1375	2500	2,032,300						
11	50%	50%	100%	2 (15 000						
11	1250	1250	2500	2,015,000						
12	55%	45%	100%	2 577 500						
12	1375	1125	2500	2,577,500						
12	60%	40%	100%	2,540,000						
13	1500	1000	2500	2,540,000						
14	65%	35%	100%	2 502 500						
14	1625	875	2500	2,502,500						
15	70%	30%	100%	2 465 000						
15	1750	750	2500	2,465,000						
16	75%	25%	100%	2 427 500						
16	1875	625	2500	2,427,500						
17	80%	20%	100%	2 200 000						
1 /	2000	500	2500	2,390,000						
10	85%	15%	100%	2 252 5 00						
18	2125	375	2500	2,352,500						
10	90%	10%	100%	0.015.000						
19	2250	250	2500	2,315,000						
22	100%	0%	100%	A A I (C A A A						
20	2500	0	2500	2,240,000						

The following observations are noticed from resulted outcomes;

- 1- Objective function value (Total Transportation Cost) decreases with the increase of direct deliveries percentage. This goes in line with the fact that ex-hub shipments incur additional shuttling cost of SR 500 / trip for volume transferred from plant and shipped from there. This is clearly demonstrated in figure 7
- 2- Combination number 1 represents exactly strategy 1 where all shipments are managed from hub with total transportation cost of SR 2,990,000
- 3- If back transportation cost of 1500 round trips at SR 500/trip (**SR 1,500,000**) is added to combination number 20, it will result in strategy II where the total cost is SR 3,740,000



B. Impact of Demand and Transportation Cost Variation on relevant Decision Variable and Total Transportation Cost

There are two main factors that could vary and hence have impact on the optimal solution. These factors are; I. The Total Demand Volume

II. The Transportation Cost (SR/KM)

The total demand is set with certain uncertainty range $\pm 15\%$ with a step change of 5% at a time; table 6 below shows the possible volume plans

	Table 0. A-LODE Annual Demand Tolerance									
-15%	-10%	-5%	MLTR	+5%	+10%	+15%				
42.5	45	47.5	50	52.5	55	57.5				
Plan 1	Plan 2	Plan 3	Base	Plan 4	Plan 5	Plan 6				

Table 6: X-LUBE Annual Demand Tolerance

Also; the transportation unit cost is subjected to increase no higher than 20% with a step change of 10% at a time at maximum. The two possible values are SR 0.88/KM and SR 0.96/KM which represent 10% and 20% increase respectively.

In order to analyze the effect of changes in the two factors on optimal solution, different scenarios are considered with various combinations of demand variation and transportation unit cost, table 7 shows these scenarios.

Table 7: Possible Scenarios of Volume and	Transportation	Cost Changes
---	----------------	---------------------

						0	
Volume-MLTR	42.5	45	47.5	50	52.5	55	57.5
SR 0.8/KM	1	4	7	10	13	16	19
SR 0.88/KM	2	5	8	11	14	17	20
SR 0.96/KM	3	6	9	12	15	18	21

For annual demand data; allocated number of trips will be calculated according the volume % of each demand point using the volume-trip conversion factor of 20 tons / trip for all various six plans similar to base plan in table 2. Now, strategy III IP model is solved for all scenarios in table 15 and results are shown in table 8 below.

Value MITD		-15%	-10%	-5%	Base	5%	10%	12%
von	ime - MILTR	42.5	45	47.5	50	52.5	55	57.5
KM	0.8	2,318,75 0	2,454,75 0	2,591,12 5	2,727,50 0	2,863,87 5	3,000,25 0	3,136,62 5
- SR/	0.88	2,466,27 5	2,611,35 0	2,756,42 5	2,901,50 0	3,046,57 5	3,191,65 0	3,336,72 5
Rate	0.96	2,614,17 5	2,767,95 0	2,921,72 5	3,075,50 0	3,229,52 5	3,383,05 0	3,536,82 5

Table 8: Summary of Objective Function Values for Different Business Plan Scenarios

Below are the conclusions resulted from relevant data analysis,

- Increasing transportation unit cost by 10% results in raising the total transportation cost by 6% while 20% increase in transportation unit cost results in 13% rise in total transportation cost.
- Increasing the annual demand volume by 5% while keeping same transportation unit cost results in raising total transportation cost by 5%
- Similarly; decreasing the annual demand volume by 5% while keeping same transportation unit cost results in declining total transportation cost by an average of 5%
- Increasing both demand volume and transportation unit cost simultaneously will result in increasing total transportation cost by more than 10% overall
- Strategy III optimal solution demand shares will remain optimal under examined ranges; ± 15% of business volume and +20% of transportation cost. Table 9 below shows optimal solution demand shares

	Table 7. Optimal Solution of Strategy III II Model										
Cost	Variable	Shipment Route	Optimal Solution								
C ₁₂	X ₁₂	Plant to Hub	65% of Total Demand								
C ₁₃	X ₁₃	Plant to Jeddah	50% of Jeddah Demand								
C ₁₅	X ₁₅	Plant to Dammam	100% of Dammam Demand								
C ₂₃	X ₂₃	Hub to Jeddah	50% of Jeddah Demand								
C ₂₄	X ₂₄	Hub to Riyadh	100% of Riyadh Demand								
C ₂₆	X ₂₆	Hub to Khamis Mushait	100% of Khamis Demand								
C ₂₇	X ₂₇	Hub to Buridah	100% of Buridah Demand								
C ₂₈	X ₂₈	Hub to Tabuk	100% of Tabuk Demand								

Table 9: Optimal Solution of Strategy III IP Model

Overall; total transportation cost increases proportionally with volume increase for the same transportation cost (SR/KM). Figure 8 below shows the impact of increasing the volume for all three transportation cost values SR/KM 0.8, 0.88 and 0.96.



Figure 8: Impact of Volume & Transportation Cost on Total Cost

C. Logistics Services Outsourcing and Its Impact on Relevant Logistics Costs

Previous analysis assumes exactly same setup and operating cost of distribution hub in all examined strategies. In fact and in order to be more realistic in the approach, a 3rd party logistics (3PL) service contract can be initiated with agreed variable cost per pallet per month with monthly payment for exactly handled number of pallets. Below are some figures to be considered in determining the monthly cost of 3PL service contract;

- I. Monthly Inventory Turnover Rate = 2 \rightarrow Average Holding Time = 0.5 month
- II. Average 3PL Handling Cost = SR 18 / Pallet / Month as per contract
- III. Inventory Holding Cost= (SR18/Month)× 0.5 Month × Total Annual Handled Pallets

Hence, Table 4.8 shows the total cost including both transportation and handling costs for each strategy. For strategies I and II, the handling cost is the same as same number of handled pallet is assumed which unlike the case of strategy III where direct and indirect deliveries are split.

Combina tion	Dire ct	In	direct	Tot al	Total Transport ation Cost-SR	Total Handl ing Cost - SR	Total Cost - SR															
1	I	0	100 %	100 %	2,990,000	450,0	3,440,															
		0	250 0 95	250 0 100		00	000	-														
2	1	25	% 237	% 250	2,952,500	427,5 00	3,380, 000															
	1	0%	5 90 %	0 100 %		405.0	3.320.															
3	2	250	225 0	250 0	2,913,000 00 000																	
4	1	5%	85 % 212	100 % 250	$\frac{6}{60}$ 2,877,500 $\frac{382,5}{00}$ 3,260, 000	$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	$\begin{array}{c} 0 \\ 0 \\ 0 \\ 0 \\ \end{array}$ 2,877,500 $\begin{array}{c} 382,5 \\ 00 \\ 000 \\ \end{array}$ 3,260, 000	$7,500$ $\begin{array}{c} 382,5 \\ 00 \\ 000 \end{array}$ $\begin{array}{c} 3,260, \\ 000 \\ 000 \end{array}$	60,													
	3	375 	5 80	0 100					Ann To Transport ual Ha ation Cost Palle in ts Co	Total Handl ing Cost	Total											
5	5	500	% 200 0	% 250 0	2,840,000	360,0 00	3,200, 000	Transport ation Cost			Total Cost											
6	2	5%	75 %	100 %	2.802.500	337,5	3,140,	-		15	Cost											
	6	525	187 5 70	250 0 100	_,,	00	000															
7	3	0% 750	% 175	% 250	2,765,000 315,0 00	$2,765,000 \begin{array}{ c c c c c c c c c c c c c c c c c c c$,765,000 315,0 00		5,000 315,0 3,08 00 000		2,765,000 315,0 00		765,000 315,0 3,080, 00 000									
	3	5%	0 65 %	0 100 %		292.5	3.020.															
8	8	375	162 5	250 0	2,727,500	00	000															
9	4	0%	60 % 150	100 % 250	2,690,000	270,0 00	2,960, 000															
	1	000 5%	0	0																		
10	1	125	% 137 5	% 250 0	2,652,500	247,5 00	2,900, 000		2,900, 000													
11	5	0%	50 %	100 %	2,615,000	225,0 00	2,840, 000															

Table 10: Total Supply Cost of the Three Distribution Hub Operating Strategies

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	1250	125	250							
		0	0							
12	55%	45 %	100 %	2.577.500	202,5	2,780,				
	1375	112 5	250 0	2,011,000	00	000				
12	60%	40 %	100 %	2 5 40 000	180,0	2,720,				
13	1500	100 0	250 0	2,540,000	00	000				
	65%	35 %	100 %		157.5	2.660.				
14	1625	875	250 0	2,502,500	00	000				
	70%	30 %	100 %		135.0	2.600.				
15	1750	750	250 0	2,465,000	00	000				
	75%	25 %	100 %		112.5	2,540.				
16	1875	625	250 0	2,427,500	00	000				
	80%	20 %	100 %	• • • • • • • • •	90.00	2,480.				
17	2000	500	250 0	2,390,000 0	0	0 000				
10	85%	15 %	100 %	a a za zoo	67,50	2,420,				
18	2125	375	250 0	2,352,500	352,500 0	0 000				
10	90%	10 %	100 %	2 21 5 000	45,00	2,360,				
19	2250	250	250 0	2,315,000	Ó	000				
20	100 %	0%	100 %	2 2 4 0 0 0 0		2,240,				
20	2500	0	250 0	2,240,000	0	000				
			Strate	gy						
			Ι				SR 2,990,000	50,00 0 Palle ts	SR 450,00 0	SR 3,440, 000
			П				SR 3,740,000	50,00 0 Palle ts	SR 450,00 0	SR 4,190, 000
			111				SR 2,727,500	32,50 0 Palle ts	SR 292,50 0	SR 3,020, 000

In conclusion; strategy III is still shown as the best alternative to select and go for. Also; 3PL service contract with agreed variable cost is highly recommended versus setting up X-LUBE own distribution hub due to the following facts.

- Elimination of distribution hub setup cost, given that the minimum space needed is 2000 square meters with an average setup cost of SR 1.2 million.
- 3PL service contract with variable cost provides high level of flexibility in case of sales volume drop/increase due to market conditions changes.

In summary; this study recommends that X-LUBE company to go for strategy 3 where direct deliveries to be managed via plant while indirect ones to be processed through variable-cost 3PL service contract. Additionally; it is proposed that X-LUBE company works to increase the portion of direct versus indirect deliveries as this results in reducing total cost

given that handling cost will not exceed 18% of total transportation cost and 15% of total cost. Table 19 below shows both transportation and handling cost for strategy III for various direct-indirect split combinations.

Moreover, the impact of direct and indirect deliveries percentages on relevant logistics costs is shown in figures 6 and 7 respectively. Table 11 below also summarize the impact of different types of deliveries on logistics costs.

Combination	Direct	Indirect	Total	Total Transportation Cost-SR	Total Handling Cost - SR	Total Cost - SR
1	0	100%	100%	2,990,000 450,000		3,440,00
۲.	0	2500	2500	2,990,000	450,000	0
2	5% 95% 100% 2.952.500 427.500		427 500	3,380,00		
۷۲	125	2375	2500	2,332,300	427,500	0
2	10%	90%	100%	2 915 000	405 000	3,320,00
	250	2250	2500	2,313,000	403,000	0
4	15%	85%	100%	2 877 500	382 500	3,260,00
•	375	2125	2500	2,077,000	562,550	0
5	20%	80%	100%	2.840.000	360.000	3,200,00
	500	2000	2500	2,010,000	500,000	0
6	25%	75%	100%	2.802.500	337.500	3,140,00
-	625	1875	2500	_,,	,	0
7	30%	70%	100%	2.765.000	315.000	3,080,00
	750	1750	2500	,,	,	0
8	35%	65%	100%	2,727,500	292,500	3,020,00
	875	1625	2500	, ,	,	0
9	40%	60%	100%	2,690,000	270.000	2,960,00
	1000	1500	2500	, ,	,	0
10	45%	55%	100%	2,652,500	247,500	2,900,00
	1125	1375	2500		-	0
11	50%	50%	100%	2,615,000	225,000	2,840,00
	1250	1250	2500		-	0
12	55%	45%	100%	2,577,500	202,500	2,780,00
	1375	1125	2500			U
13	60%	40%	100%	2,540,000	180,000	2,720,00
	1500	1000	2500			U
14	65%	35%	100%	2,502,500	157,500	2,660,00
	1625	875	2500			0
15	70%	30%	100%	2,465,000	135,000	2,600,00
	1/50	750	2500			0
16	/5% 1075	25%	2500	2,427,500	112,500	2,540,00
	1912	200/	2500			2 400 00
17	80%	20% E00	100%	2,390,000	90,000	2,480,00
	2000 QE0/	500 1E%	2500			2 420 00
18	0J/0 2125	275	2500	2,352,500	67,500	2,420,00
	2123	10%	2000			2 2 2 0 00
19	30% 2250	10%	100% 2500	2,315,000	45,000	2,360,00 N
	2230	230	2500			2 240 00
20	100%	0%	100%	2,240,000	0	0

Table 11: Total Cost of the Best Distribution Hub Operating Strategy III

indirect deliveries increase results in raising all relevant costs. The impact interdependency of direct and indirect

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deliveries on all types of costs is shown in figure 11



Figure 9: Direct Deliveries Impact on Logistics Costs



Figure 10: Indirect Deliveries Impact on Logistics Costs



Figure 11: Deliveries/Costs Impact Interdependency

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5. CONCLUSION

Distribution Hub Operating Strategy

For X-LUBE Distribution Hub Operating Strategy, it is obvious that hybrid distribution strategy is the most cost efficient option to for as operating strategy; Table 12 shows the summary of distribution hub operating strategy along with associated annual cost. This strategy enhances the best utilization of both plant and transportation resources as direct and full orders will be shipped directly from plant while partial orders will be prepared in the distribution hub then shipped to the demand points in X-LUBE network. Also; this strategy avoid unnecessarily products handling and transfers which helps in reducing extra touches to the products and hence better management of products' quality and conditions.

	Table 12. Distribution Hub Operating Strategy Outcome									
Strategy	Strategy Description	Annual Cost-SR								
1	In-Transient Storage Hub	SR 2,990,000								
2	Exclusive Storage Hub	SR 3,740,000								
3	Hybrid Distribution Strategy	SR 2,727,500								

From strategy III sensitivity analysis; it can be concluded that objective function value (total transportation cost) proportionally increases with direct deliveries raise and indirect deliveries decline. Also; objective function value will increase or decrease with almost the same percentage by which volume is increases or decreased with respect to the base plan of fifty million liters. Also; increasing the transportation cost by 10% results in raising the objective function value by 6% while it incurs 13% increase if transportation costs increases to 20%. Moreover; the percentage regional split of optimal solution remains the same within $\pm 15\%$ of volume along with 10% and 20% of transportation cost.

On top of above; it can be concluded that strategy III along with variable-cost 3PL contract is the best operating setup for X-LUBE, aiming to reduce the portion of plant direct deliveries at the cost of distribution hub indirect deliveries as this will results in overall supply cost reduction as shown in above relevant analysis.

Further extension to this study can be made to include other dimensions, i.e. reverse logistics and orders returns [8, 10], retailers' distribution network and sites [11] and orders requirements determination [7]. Also, vendor-managed-inventory can be assumed once retailers' distribution networks are considered in the optimization model [12]

Appendix 1

Distribution Transportation Costs

Various costs are incurred in transportation operation which includes manpower, registration fuel, maintenance, insurance and others. The details of these costs and their contribution to transportation unit mileage will be shown and explained below. Table A.1 shows the details of insurance cost of transportation fleet. Similarly; Table A.2 shows registration and license costs details based on eight years of service.

Tuste This insurance Cost Details Calculation									
Brand	Model (5 Years	Market Value		Total	Insurance %	Insurance Amount SD			
Dialid	Old)	Head	Flat Bed	Total	msurance 70	Insurance Amount-SK			
Mercedes Benz	2012-2016	270,000	85,000	355,000	3%	10,650			
Man	2012-2017	230,000	85,000	315,000	3%	9,450			
Volvo	2012-2018	250,000	85,000	335,000	3%	10,050			
			Total	Annual Cost	10,050				
	Vehicle Insura	nce Cost	Monthly Average Cost		838				
			C	ost / KM	SR 0.056				

Table A.1: Insurance Cost Details Calculation

Table A.2: Registration and License Cost Details Calculation

Year of Service	1	2	3	4	5	6	7	8
Vehicle Registration Fees	4,500	0	0	600	0	0	600	0
Annual Inspection Program	158	158	158	158	158	158	158	158
Operating Card	100	100	100	100	100	100	100	100

GBS	1,700	1,700	1,700	1,700	1,700	1,700	1,700	1,700
Driver's License Fees	200	0	200	0	200	0	200	0
Total	6,658	1,958	2,158	2,258	2,158	1,958	2,758	1,958
	An	nual Avera	age	22,200				
Registration a	Moi	nthly Ave	rage	2,775				
						Cost / KM		0.185

Table A.3: Total Transportation Cost Details Calculation

Transportation Cost Details Calculator								
Fleet & Operations Details								
Vehicle Utilization	km/year	180,000						
Sump Capacity (Liters per Oil Change Service)	liters	32						
Vehicle Mileage (No. of KM driven in 1 liter fuel)	km	2.50						
Vehicle Downtime (per oil change service)	hours	3.00						
Filter Set Price (one piece to be replaced per Oil Change Service)	SAR	82.00						
Diesel Price (per liter)	SAR	0.47						
Vehicle Downtime Cost per Oil Service (lost production time)	SAR	60.0						
Key Elements Definitions	•							
Oil Price / Liter	SAR	7.00						
Top up Quantity (during one oil service)	liters	2.00						
Oil Change Interval	km	10,000						
No. Of Oil Changes/year	number	18.00						
Oil Annual Consumption	liters	612.0						
Other Oil Change Related Cost (Down Time Cost + Filter Cost)	SAR	262.0						
Consumables Cost Figures (Fuel and Oil)	SAR	Figures						
Annual Oil Cost (=Annual Consumption × Oil Price/Liter)	SAR	9,000						
Average Oil Cost Per Km (=Annual Oil Cost/Truck Annual Mileage)	SAR	0.05						
Average Fuel Cost Per Km (=Diesel Cost/Liter/Vehicle Mileage/Fuel Liter)	SAR	0.188						
Total Operating Cost Per Km (Fuel and Oil)	SAR	0.238						
Operational Cost Figures	SAR	Figures						
Driver Salary	SAR	5,000						
Regular Maintenance	SAR	2,500						
Insurance	SAR	838						
Registration & License Fees	SAR	231						
Total Monthly Cost	SAR	8,569						
Total Annual Cost	SAR	102,825						
Total Annual Mileage	SAR	180,000						
Number of Monthly KM	SAR	15,000						
Operational Cost Per Unit KM	SAR	0.57						
Total Cost per Unit Distance - KM	SAR	0.8						

In addition to the above, the transportation costs between all possible combinations / combinations has to be calculated with reference to Total Cost per Distance Unit figure. The distances between all supply and demand cities are shown in the below table A.4.

Cities	3	4	5	Plant	6	7	8
3	Х	360	1080	1200	1400	600	1200
4	360	Х	760	880	1040	280	880
5	1080	760	Х	280	840	680	520
Plant	1200	880	280	Х	520	800	840
6	1400	1040	840	520	X	800	1320
7	600	280	680	600	800	X	1200
8	1200	880	520	840	1320	1200	Х

Table A.4: Distances between Supply and Demand Cities in KSA Network in KM

Using the "Total Cost per Distance Unit" to convert the above distances to their equivalent transportation costs will result in the below table A.5

Cities	3	4	5	Plant	6	7	8
3	Х	450	1350	1500	1750	750	1500
4	450	Х	950	1100	1300	350	1100
5	1350	950	Х	350	1050	750	650
Plant	1500	1100	350	Х	650	1000	1050
6	1750	1300	1050	650	Х	1000	1650
7	750	350	850	750	1000	Х	1500
8	1500	1100	650	1050	1650	1500	Х

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