

# “Centralized Ordering Policies in a Multi-Warehouse System with Lead Times and Random Demand”

A paper by Gary Eppen and Linus Schrage

Presentation by Tor Schoenmeyr

This is a summary presentation based on: Eppen, Gary, and Linus Schrage. “Centralized Ordering Policies in a Multi-Warehouse System with Lead times and Random Demand.” *TIMS Studies in the Management Sciences*, Vol. 16: Multi-Level Production/Inventory Control Systems, Theory and Practice. Edited by Leroy B. Schwarz. 1981.

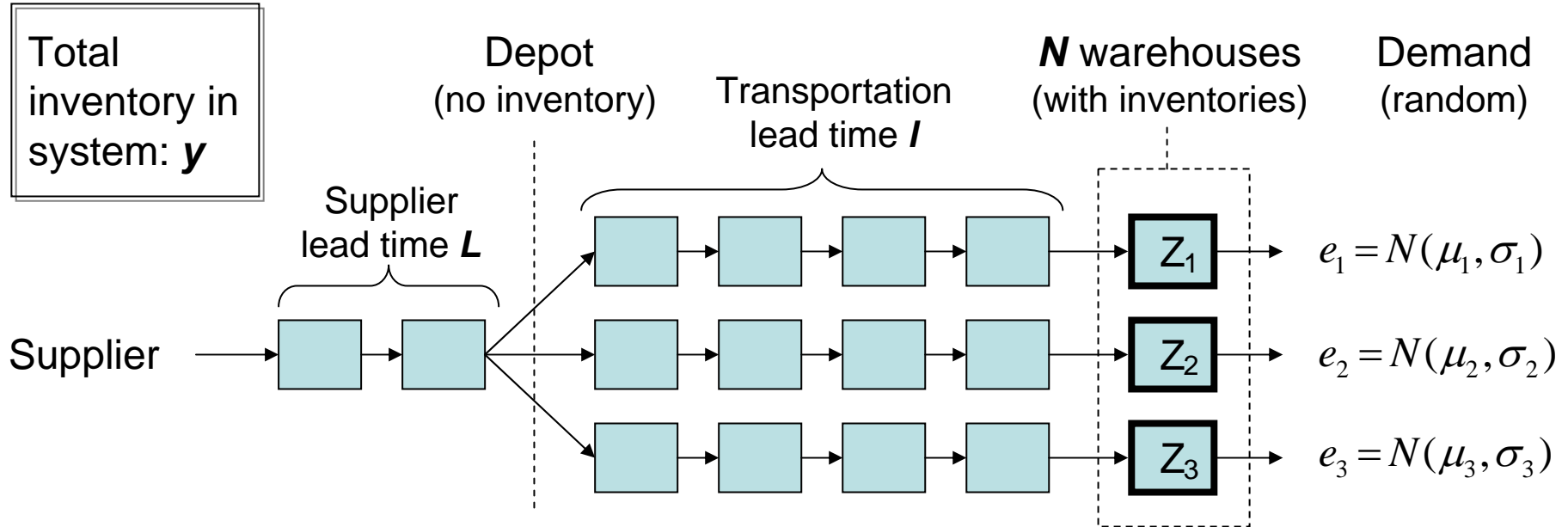
## System and Problem Description

The Allocation Assumption

Policy 1: Order up to  $y$  every period

Policy 2: Order up to  $y$  every  $m$  periods

# System Description and Assumptions



## Costs to be minimized:

- Holding cost  $h$  per unit in inventory
- Penalty cost  $p$  per unit of unmet demand (placed in backlog)
- Fixed cost  $K$  for every order placed

## Decisions to be made every period:

- How much, if anything, should be ordered from the supplier
- How should we distribute the incoming orders at the Depot

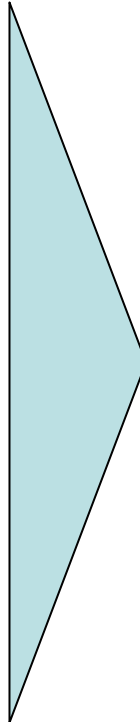
# Why have a Depot?

(with no inventory)

## Problem

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- Separate warehouses have little purchasing power
- Demand fluctuates for the individual warehouse
  
- It is expensive/ impractical to build a depot
  
- (Demand can vary also in the aggregate)



## Depot Benefit

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- Exploit quantity discounts from the supplier
- Fluctuations in different warehouses even out, and you gain “statistical economies of scale”
- Depot need not to be a physical entity (the point is that goods are allocated after orders completed)
- (Maybe a depot with inventory can do even better)

# Applicability of model

Good application:  
Steel for conglomerate

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Questionable application:  
Coca-Cola for 7-Eleven

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Production  
lead times:

Long

Short

Inventory  
surplus:

Holding costs  
(expensive)

Cheap, not to say  
desirable (up to shelf  
capacity)

Inventory  
shortfall:

Order placed  
on “backlog” at  
some penalty

Customer walks (or  
buys a substitute)

# System and Problem Description

## The Allocation Assumption

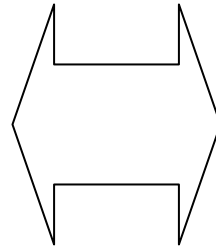
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# Allocation Assumption

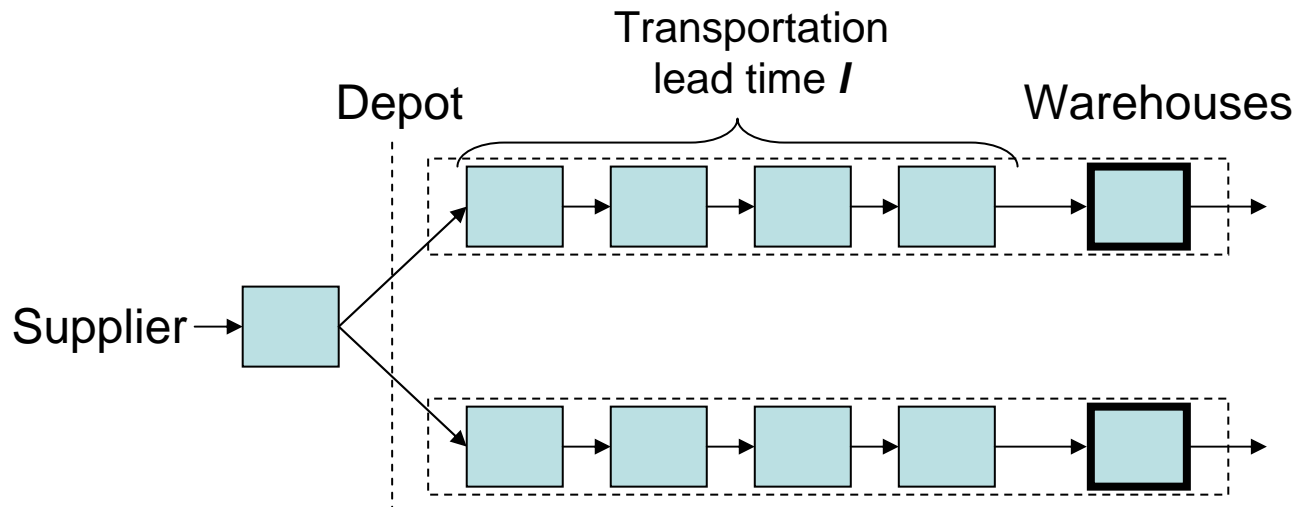
(for every period ordering, normal demand)

“Every period  $t$ , we can make an allocation (at the depot) such that the probability of running out at each warehouse is the same at period  $t+l$ ”

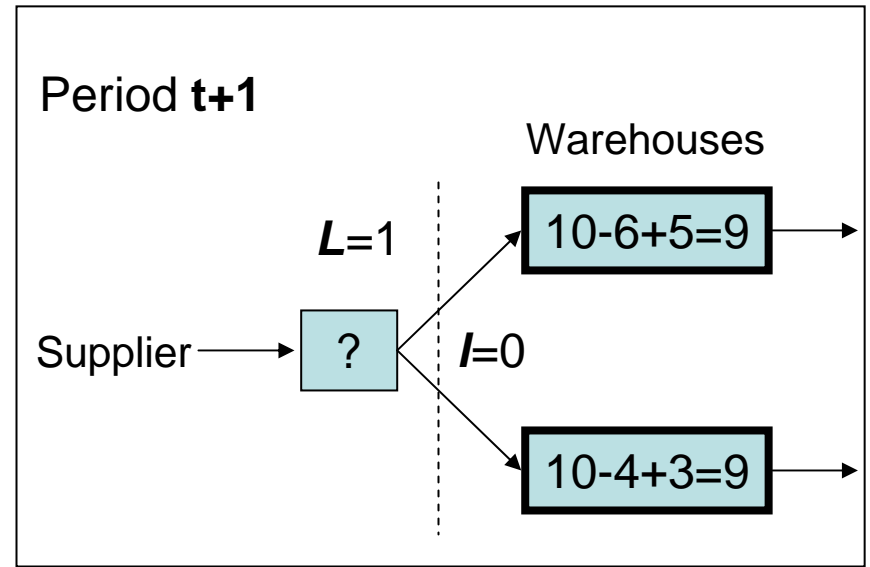
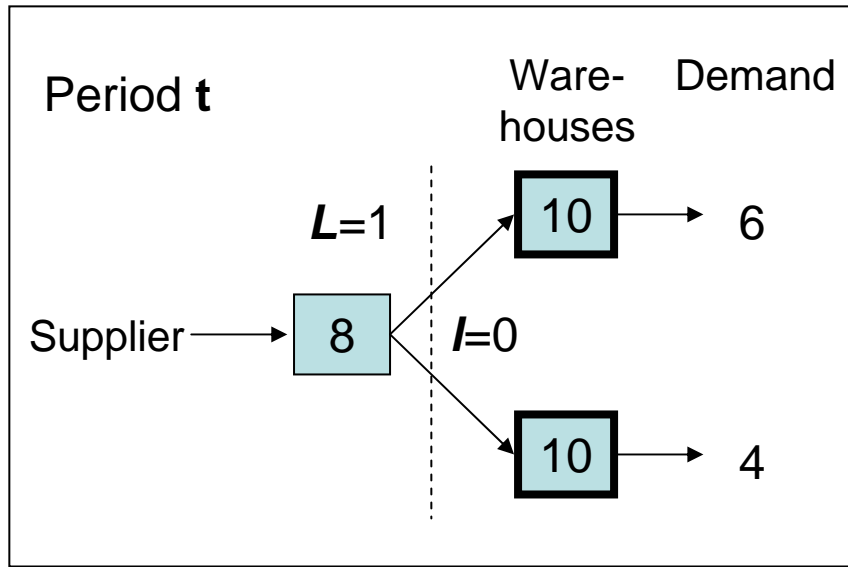


“Every period, we can find a constant  $v$ , such that the total inventory at and in transit to the  $i$ th warehouse is:

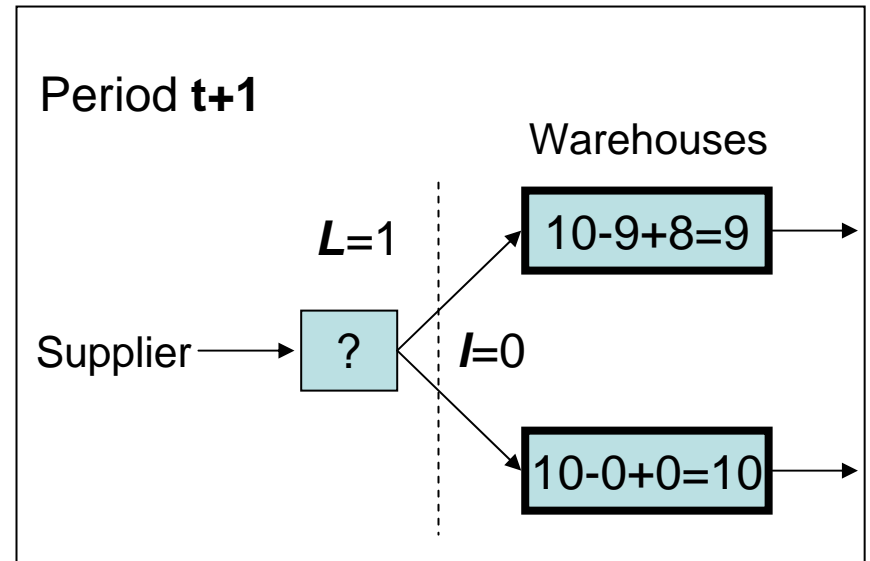
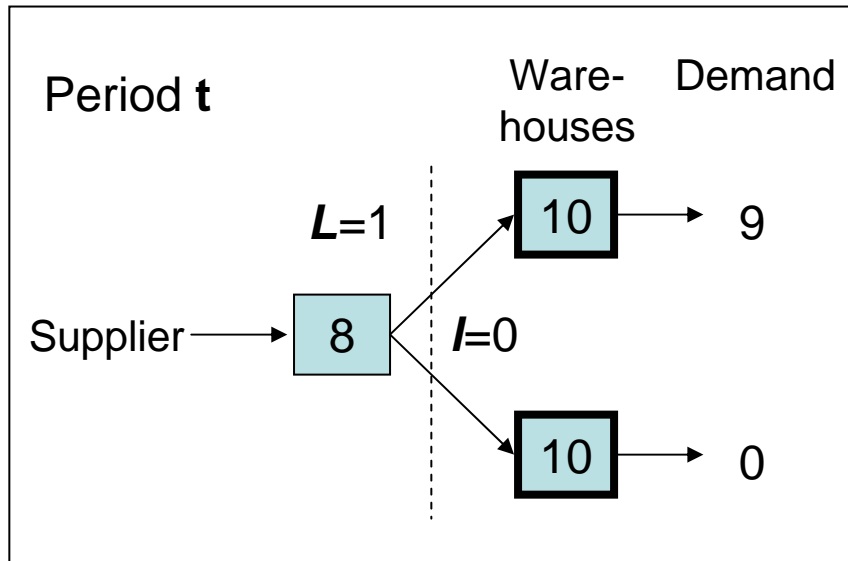
$$(l+1)\mu_i + v\sigma_i\sqrt{l+1}$$



## Example when Allocation Assumption holds (identical warehouses)



## Example when Allocation Assumption is violated (identical warehouses)





# The Allocation Assumption holds for high $\mu/\sigma$ and low $N$

## Theoretical Result

Eppen and Schrage derive a good theoretical approximation formula for the probability of A.A. being true.

The paper does not explain how “negative demand” should be interpreted. This happens frequently in the lower left corner where my experiments gave different results than those of the paper

Probability of A.A. being true according to experiment presented in paper (my experiment in parenthesis) Percent

$\mu/\sigma$ $N$	$1/2$	1	$3/2$	2	$5/2$
2	32.6 (35.9)	66.3 (66.3)	85.8 (86.5)	95.2 (95.5)	98.8 (98.8)
3	20.1 (19.8)	54.7 (53.2)	79.8 (79.0)	93.0 (93.5)	98.1 (98.2)
4	11.4 (10.0)	43.1 (41.0)	73.3 (72.0)	90.1 (90.5)	97.3 (97.4)
5	7.6 (4.9)	36.5 (30.6)	68.6 (65.8)	88.3 (88.0)	96.5 (96.9)
6	4.6 (2.5)	29.9 (22.3)	63.2 (60.7)	86.4 (85.2)	96.1 (95.8)
7	2.8 (1.2)	24.5 (15.8)	59.1 (53.5)	84.1 (83.2)	95.5 (95.5)
8	1.6 (0.5)	20.4 (11.0)	54.3 (46.6)	82.0 (80.5)	94.6 (95.3)

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# Policy 1: Order Every Period (fixed ordering costs $K = 0$ )

**Problem:**

**Intuitive answer:**

**But...**

How should we distribute the goods that come in to the depot every period?

We should distribute goods so that total goods at and en route to every factory is “the same”

But is this always possible?  
If we make the A.A., then yes!

How much should we order from the factory every period?

We should order so that the same total inventory level  $y$  is achieved every period.  
(=order last period's demand)

What should be the value of  $y$ ?

# Eppen and Schrage find an analytical expression for the inventory at each warehouse

We know how much is ordered every period (as a function of  $y$ )

We know how the incoming goods are split up at the Depot

We know the (random function for) demand at each warehouse

Eppen and Schrage derive this expression for the inventory  $S$  at each warehouse (simplified form for the case of identical warehouses):

$$S_j = (l+1)\mu + \frac{y}{N} - (l+1)\mu - \frac{\sum_{t=1}^L \sum_{i=1}^N e_{it}}{N} - \sum_{t=L+1}^{L+l} e_{jt}$$

Fixed component

Random component

The problem is now equivalent to the newsboy problem, and can be solved analytically

### Newsboy problem

“The newsboy buys  $i$  newspapers, at a cost  $c$  each. He sells what is demanded  $d$  (random variable), or all he has got  $i$ , whichever is less, at a price  $r$ . Any surplus is lost.”

	Deterministic inventory	Random inventory	Cost of surplus (per unit)	Cost of shortage (per unit)
Newsboy	$i$	$-d$	$c$	$r-c$
Our system (at warehouse)	$(l+1)\mu + \frac{y}{N}$	$(l+1)\mu - \frac{\sum_{t=1}^L \sum_{i=1}^N e_{it}}{N}$	$h$	$p$

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# Policy 2: Order Up to level $y$ every $m$ periods

- + We can select  $m$  and  $y$  to minimize total costs, including fixed ordering costs  $K$
- + Periodic ordering policy easy to implement in practice
- + Authors claim that theoretical results on this policy has wider applicability
- Certain approximations have to be made to find the best  $m$  and  $y$
- Even if the best  $m$  and  $y$  were to be found, the periodical ordering policy isn't necessarily optimal

# Several new assumptions lead to an analytical solution for the periodic ordering policy

