

Logistics Systems Design: Inventory Systems

1. Introduction
2. Forecasting
3. Transportation Systems
4. Transportation Models
5. **Inventory Systems**
6. Supply Chain Systems

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Inventory Systems Overview

- ❶ Introduction
- ❷ Independent Demand Systems
- ❸ Dependent Demand Systems

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Inventory Systems Overview

- ❶ **Introduction**
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- ❸ Dependent Demand Systems

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Inventory

- * Material Being Held in Storage
- * Buffer Between and Decoupling of Two Subsequent Processes

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Historical Perspective on Inventory

- * Before 20th Century Desirable Wealth
 - Maximized
- * Early 20th Century Wasteful
 - Minimized
- * Currently an Expensive But Necessary Evil
 - Tradeoff or Balance

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Inventory Objective and Cost

- * Provide Some Specified Service Level at Minimum Cost
- * Common Service Level Definition = Proportion of Long Range Demand Delivered From Inventory (P_2 or β)
- * Cost = 25 % of Value per Year and Rising

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Customer Service Level Definitions

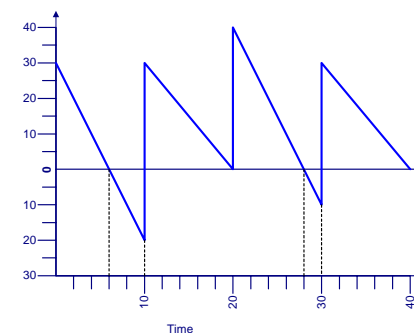
- * Cycle service level α (P_1) long range probability of no stock-out (count)
- * Fill rate β (P_2) long range fraction of demand delivered from inventory (size)
- * γ (P_3) ratio of cumulative unsatisfied demand over total average demand (size and time),
- * ready rate alternative definition

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Customer Service Levels Example Demand Graph



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Customer Service Levels Example Computations

$$d = \frac{\sum_{i=1}^T d_i}{T} = \frac{160}{40} = 4$$

$$\alpha = 1 - \frac{2}{4} = 0.50$$

$$\beta = 1 - \frac{20+10}{160} = 0.81$$

$$\gamma = 1 - \frac{(5+10+15+20+5+10)/40}{4} = 0.59$$

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Inventory Performance

- * **Stock Turnover (Turns per Year)**
 - Cost of Annual Sales Divided by Average Value of Inventory
- * **Average Time in Inventory (Years)**
 - Inverse of Stock Turnover

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Inventory Justification

- * **Economies of Scale**
 - Production
 - Transportation
- * **Response Time Constraints**
 - Emergency
 - Seasonal
- * **Required Aging Processes**
- * **Hedging Against Price Changes**

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Inventory Justification

- * **Amplified by Uncertainty**
 - Demand
 - Production yield and lead time
 - Transportation time
 - Sales price and exchange rates

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Inventory Tradeoffs

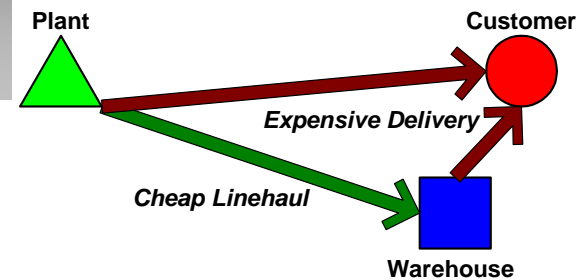
- * Tradeoff with Transportation Costs and Schedules
- * Tradeoff with Production or Purchasing Costs and Schedules
- * Tradeoff with Lost Profit and Lost Sales

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Direct Shipping Cost Tradeoff

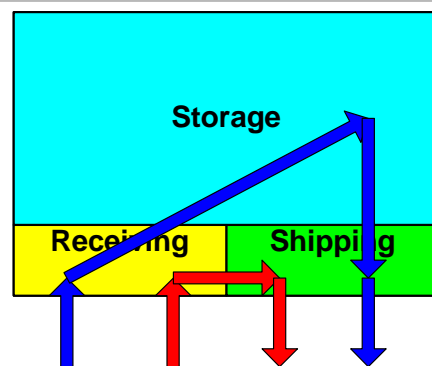


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Cross Docking Material Handling Tradeoff



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Inventory Types

- * Pipeline Inventory
- * Cycle Inventory
- * Safety Inventory
- * Seasonal Inventory
- * Aging Inventory
- * Speculative Inventory

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Inventory Materials

- * *Raw Materials*
 - Incoming to Organization
- * *Work in Process*
 - Internal to Organization
- * *Finished Goods*
 - Outgoing from Organization

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Inventory Questions

- * *What to Store*
- * *Where to Store*
- * *When to Place an Order*
- * *How Much to Order*

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Inventory Costs

- * *Unit Cost or Unit Value (\$/Unit)*
- * *Reorder Cost (\$/Order)*
- * *Holding Cost (\$/Unit-Year)*
 - Holding cost rate (\$/\$-Year)
- * *Shortage Cost (\$/Unit)*
 - Backorder cost
 - Lost sales cost

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Inventory Policy Classes

- * *Fixed Order Quantity Systems*
 - Adjust order time
 - Small irregular demand
- * *Fixed Order Frequency Systems*
 - Adjust order quantity
 - High or regular demand
- * *Direct Demand Satisfaction*
 - Adjust quantity and time
 - Push or Pull

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Pull Inventory Policies

- * *Each Stocking Point Considered Independent*
- * *Replenishment Based on Local Conditions*
- * *Precise Local Inventory Control*
- * *Ignores Impact on Other Elements of the Supply Chain*
- * *Retail Systems*

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Push Inventory Systems

- * *Stocking Point Viewed as Component in the Supply Chain*
- * *Replenishment Based on Forecasted Requirements*
- * *Central Inventory Control*
- * *Inventory Levels are Set Collectively*
- * *Depends Strongly on Forecast Quality*
- * *Production Systems*

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Inventory Systems Overview

- 1 *Introduction*
- 2 *Independent Demand Systems*
- 3 *Dependent Demand Systems*

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Independent Demand Systems

- * *Deterministic or Known Demand*
- * *Stochastic or Uncertain Demand*

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Pipeline Inventory

* In-Transit or Aging & Curing Inventory

* Notation

- PI = Pipeline inventory (units)
- D = Total demand (units / year)
- TT = Transit time (years)

$$PI = D \cdot TT$$

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Cycle Inventory

* Transition Between Regular Input and Output Quantities (Batch Sizes)

* Notation

- CI = Cycle inventory (units)
- d = Periodic demand (units / period)
- CT = Cycle time (years)
- ct = Cycle time (periods)

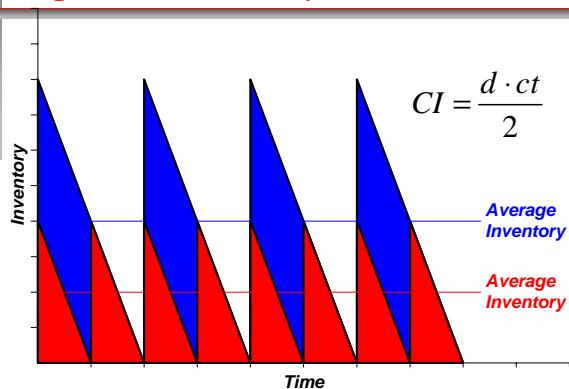
$$CI = \frac{D \cdot CT}{2} = \frac{d \cdot ct}{2}$$

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Cycle Inventory Versus Replenishment Cycle Time



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Seasonal Inventory

* Reduced production capacity by inventory accumulation in low demand periods

* Notation

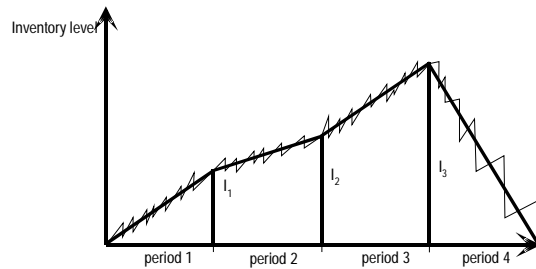
- h_k holding cost rate for period k (\$/\$.t)
- I_k inventory at end of period k
- v product value
- SIC seasonal inventory cost

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Seasonal Inventory With Constant Rates



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Seasonal Inventory Equations

- * Constant demand and production rate per period

$$SIC = v \sum_{t=1}^N \frac{h_t (I_{t-1} + I_t)}{2}$$

- * Equal periods and cyclical system

$$SIC = v \cdot h \sum_{t=1}^N I_t$$

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Repetitive Order Quantities With Instantaneous Resupply

$$TC(Q) = IC + OC$$

$$= \frac{hc \cdot Q}{2} + \frac{D}{Q} oc \quad Q^* = \sqrt{\frac{2 \cdot D \cdot oc}{hc}}$$

$$TC(Q^*) = \frac{hc}{2} \sqrt{\frac{2 \cdot D \cdot oc}{hc}} + \frac{D \cdot oc}{\sqrt{\frac{2 \cdot D \cdot oc}{hc}}}$$

$$= \sqrt{2 \cdot D \cdot oc \cdot hc}$$

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Inventory Policies Comparison Example: Data

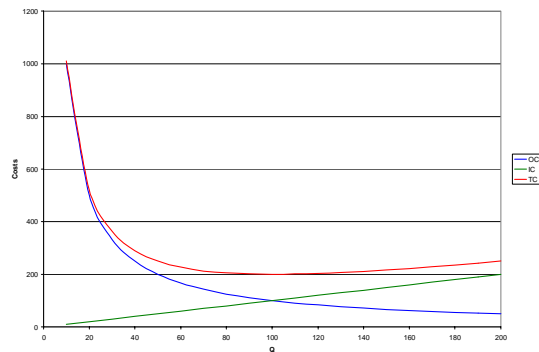
Microsoft Excel - Inventory EOQ Variants Harvey ...			
File Edit View Insert Format Tools Data Window Help			
A	B	C	D
13	Purchase Price	p	10 \$/unit
14	Lead Time	LT	0.5 year
15	Holding Cost Rate	hcr	0.2 /year
16	Shortage Cost	sc	25 \$/unit
17	Ordering Cost	oc	50 \$/order
18	Demand Rate	d	200 units/year
19	SD Demand Lead Time	sdlit	25 units
20	Probability No-Stockout	F(R)	0.98
21	Fill Rate	fr	0.98
22	SD Lead Time	slt	0.125 years
23			
24	Mean Demand Lead Time	dlt	100 units
25	SD Demand	sd	35.4 units

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Graph of Cost Tradeoffs for Known Demand



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Inventory Policies Comparison: Known Demand (Instantaneous)

$$Q^* = \sqrt{\frac{2 \cdot D \cdot oc}{hc}} \quad Q = \sqrt{\frac{2 \cdot 200 \cdot 50}{0.2 \cdot 10}} = 100$$

$$TC(Q) = IC + OC \quad TC = \frac{100 \cdot 0.2 \cdot 10}{2} + \frac{200}{100} 50 = 200$$

$$= \frac{hc \cdot Q}{2} + \frac{D \cdot oc}{Q}$$

$$R = d \cdot LT \quad R = 200 \cdot 0 = 0$$

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Inventory Policies Comparison Example: Results

Microsoft Excel - Inventory EOQ Variants Harvey Foods Example.xls

	A	B	C	D	E	F
	Type	Q	R	SI	AI	TC
1	Deterministic Demand	100	0	0	50	200.0
3	+ Lead Time	100	100	0	50	200.0
4	Stochastic Demand	100	151	51	101	302.0
5	Shortage Cost (Seq)	100	151	51	101	311.2
6	Shortage Cost (Iter)	111	143	43	99	308.5
7	Type 2 Service (Seq)	100	126	26	76	252.0
8	Type 2 Service (Iter)	114	124	24	81	249.5
9	SL2 (Iter) + Stoc. Lead Time	119	139	39	99	281.5

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Optimal EOQ Derivation

$$\frac{d(TC)}{dQ} = \frac{hc}{2} - \frac{D \cdot oc}{Q^2}$$

$$\frac{d^2(TC)}{dQ^2} = \frac{2 \cdot D \cdot oc}{Q^3} > 0$$

$$\left. \frac{d(TC)}{dQ} \right|_{Q \rightarrow 0} = -\frac{D \cdot oc}{Q^2} \Big|_{Q \rightarrow 0} = -\infty$$

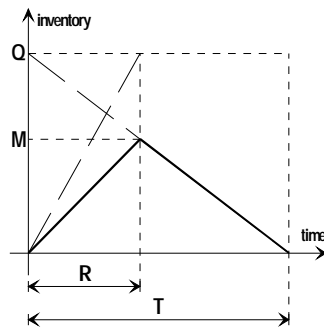
$$\frac{d(TC(Q^*))}{dQ} = \frac{hc}{2} - \frac{D \cdot oc}{Q^{*2}} = 0 \quad Q^{*2} = \frac{2 \cdot D \cdot oc}{hc}$$

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Inventory Pattern for Batch Manufacturing



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EOQ Formulas

$$\begin{aligned}
 M &= Q - d \cdot R = Q - d \left(\frac{Q}{p} \right) = Q \left(1 - \frac{d}{p} \right) \\
 TC &= IC + MC \\
 &= \frac{HC \cdot M \cdot T}{2} + FC + VC \cdot Q \\
 &= \frac{HC \cdot Q \cdot (1 - d/p) \cdot Q}{2 \cdot d} + FC + VC \cdot Q \\
 &= FC + VC \cdot Q + \frac{HC(p-d)}{2 \cdot p \cdot d} Q^2
 \end{aligned}$$

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EOQ Formulas continued

$$\begin{aligned}
 tc &= \frac{TC}{Q} = \frac{FC}{Q} + VC + \frac{HC(p-d)}{2pd} Q \\
 \frac{d(tc)}{dQ} &= -\frac{FC}{Q^2} + \frac{HC(p-d)}{2pd} Q = 0 \\
 Q^* &= \sqrt{\frac{2 \cdot FC \cdot d}{HC(1 - \frac{d}{p})}} \\
 \frac{d^2(tc)}{dQ^2} &= \frac{2 \cdot FC}{Q^3} + \frac{HC \cdot (p-d)}{2pd} > 0
 \end{aligned}$$

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Batch Manufacturing Costs and Quantities

- * **Total Cost**
 $TC = IC + MC = FC + VC \cdot Q + \frac{HC(p-d)}{2 \cdot p \cdot d} Q^2$
- * **Optimal Batch Size**
 $Q^* = \sqrt{\frac{2 \cdot FC \cdot d}{HC(1 - \frac{d}{p})}}$
- * **Optimal Total Cost**
 $TC^* = 2 \cdot FC + VC \sqrt{\frac{2pd \cdot FC}{HC(p-d)}}$

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Lead Time for Resupply Reorder Point

- * Deterministic Demand (D) and Demand rate (d)
- * Deterministic Lead Time (LT)
- * Reorder Point = Quantity On Hand when Order is Placed

$$R = d \cdot LT$$

$$dlt = d \cdot LT$$

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If Reorder Point Exceeds Maximum Inventory

- * When lead time exceeds replenishment cycle length
 $LT > Q/d$, $R > Q$
- * Two Equivalent Interpretations
 - Order when on-hand plus on-order inventory falls below reorder point
 - Order when on-hand inventory falls below reorder point modulo order quantity (or order quantity for exact multiple)

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Inventory Policies Comparison: Known Demand

$$Q^* = \sqrt{\frac{2 \cdot D \cdot oc}{hc}} \quad Q = \sqrt{\frac{2 \cdot 200 \cdot 50}{0.2 \cdot 10}} = 100$$

$$TC(Q) = IC + OC \quad TC = \frac{100 \cdot 0.2 \cdot 10}{2} + \frac{200}{100} \cdot 50$$

$$= \frac{hc \cdot Q}{2} + \frac{D}{Q} oc = 200$$

$$R = d \cdot LT$$

$$R = 200 \cdot 0.5 = 100$$

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Inventory Policies Comparison Example: Results

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Inventory Systems Overview

- ① Introduction
- ② Independent Demand Systems
 - Continuous Review
 - Periodic Review
- ③ Dependent Demand Systems

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Independent Demand Systems

- * Deterministic or Known Demand
- * Stochastic or Uncertain Demand

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Basic Pull Inventory Policies

- * Single Order Quantity
 - Equal Marginal Profit and Loss
- * Cyclical Order Quantities
 - EOQ (Infinite and finite production rate)

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Single Order Quantity

- * Single Ordering Opportunity
- * Tradeoff between Shortage and Excess Costs
- * "Newsboy" / Newsvendor Problem

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Single Order Quantity Notation

Q = purchased inventory

D = actual demand

$f(x)$ = demand distribution

$F(x)$ = cumulative demand distribution

\bar{d} = expected demand

p = sales price

c = purchase price

s = salvage value

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Single Order Quantity Expected Cost

$c_s = p - c$ if $Q \leq D$ (marginal profit)

$c_e = c - s$ if $Q > D$ (marginal loss)

$$G(Q) = c_e \int_0^Q (Q - x) f(x) dx + c_s \int_Q^\infty (x - Q) f(x) dx$$

$$\begin{aligned} \frac{dG(Q)}{dQ} &= c_e \int_0^Q f(x) dx + c_s \int_Q^\infty -f(x) dx \\ &= c_e F(Q) - c_s (1 - F(Q)) \end{aligned}$$

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Single Order Quantity Optimal Inventory

$$\frac{d^2 G(Q)}{dQ^2} = (c_s + c_e) f(Q) \geq 0 \quad \forall Q$$

$$\left. \frac{dG(Q)}{dQ} \right|_{Q=0} = c_e F(0) - c_s (1 - F(0)) = -c_s < 0$$

$$\frac{dG(Q^*)}{dQ} = (c_e + c_s) F(Q^*) - c_s = 0$$

$$F(Q^*) = \frac{c_s}{c_e + c_s}$$

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Single Order Quantity by Equilibrium Theory

* At the optimal inventory level the expected profit of selling one more items equals the expected loss of one item of excess inventory

$$c_s (1 - F(Q^*)) = c_e F(Q^*)$$

$$F(Q^*) = \frac{c_s}{c_e + c_s}$$

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Optimal Inventory Level From Cumulative Frequency Lookup

- * Compute demand frequencies and sort by increasing demand
- * Compute cumulative demand frequencies

$$F(Q^*) = \frac{c_s}{c_e + c_s}$$

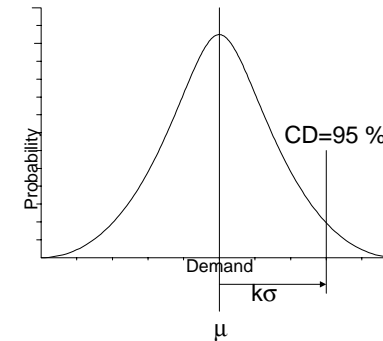
$$Q^* = \min \left\{ x \mid F(x) \geq \frac{c_s}{c_e + c_s} \right\}$$

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Normally Distributed Demand



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Single Order Quantity Optimal Inventory From Distribution

$$z^* = N^{-1} \left(\frac{c_s}{c_s + c_e} \right)$$

$$Q^* = \bar{d} + z^* \sigma_D$$

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Testing If Demand Distribution Is Normal

- * χ^2 Goodness of Fit Test
- * Coefficient of Variation < 0.5
- * Probability of Negative Demand Less Than 2 %
- * Probability of Demand More Than Mean Plus Two Standard Deviations Less Than 2 %

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Testing If Demand Distribution Is Normal (Formulas)

$$CV = \frac{\sigma}{\mu} \leq 0.5$$

$$P[x < 0] = F(0) \leq 0.02$$

$$P[x > \mu + 2\sigma] = 1 - F(\mu + 2\sigma) \leq 0.02$$

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Single Order Quantity Example: Data

	A	B	C	D	E	F	G	H	I	J
1	15	19	9	12	9	22	4	7	8	11
2	14	11	6	11	9	18	10	0	14	12
3	8	9	5	4	4	17	18	14	15	8
4	6	7	12	15	15	19	9	10	9	16
5	8	11	11	18	15	17	19	14	14	17
6	13	12								

Data = Actual Sales Plus Unmet Demand

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Single Order Quantity Example: Frequency Distributions

	B	C	D	E
1	Bin	Frequency	Rel Freq	Cum Freq
2	0	1	0.01923	0.0192
3	1	0	0.00000	0.0192
4	2	0	0.00000	0.0192
5	3	0	0.00000	0.0192
6	4	3	0.05769	0.0769
7	5	1	0.01923	0.0962
8	6	2	0.03846	0.1346
9	7	2	0.03846	0.1731
10	8	4	0.07692	0.2500
11	9	6	0.11538	0.3654
12	10	2	0.03846	0.4038
13	11	5	0.09615	0.5000
14	12	4	0.07692	0.5769
15	13	1	0.01923	0.5962
16	14	5	0.09615	0.6923
17	15	5	0.09615	0.7885
18	16	1	0.01923	0.8077
19	17	3	0.05769	0.8654
20	18	3	0.05769	0.9231
21	19	3	0.05769	0.9808
22	20	0	0.00000	0.9808
23	21	0	0.00000	0.9808
24	22	1	0.01923	1.0000
25	More	0	0.00000	
26	52	1	0.00000	

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$$c_s = 75 - 25 = 50$$

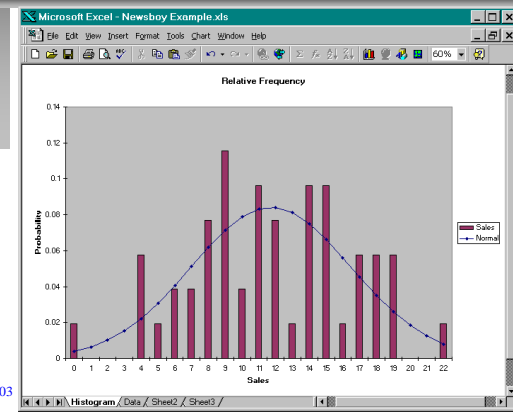
$$c_e = 25 - 10 = 15$$

$$F(Q^*) = \frac{50}{50 + 15} = 0.77$$

$$Q^* = \min\{x \mid F(x) \geq 0.77\}$$

$$= 15$$

Single Order Quantity Example: Histogram

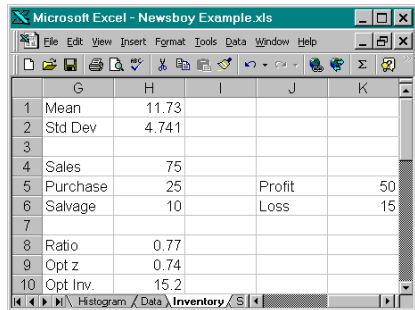


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Single Order Quantity Example: Optimal Inventory



	G	H	I	J	K
1	Mean	11.73			
2	Std Dev	4.741			
3					
4	Sales	75			
5	Purchase	25		Profit	50
6	Salvage	10		Loss	15
7					
8	Ratio	0.77			
9	Opt z	0.74			
10	Opt Inv.	15.2			

$$11.73 + 0.74 \cdot 4.74 = 15.2$$

$$F = \frac{50}{65} = 0.77$$

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Basic Pull Inventory Policies

- * **Single Order Quantity**
 - Equal Marginal Profit and Loss
- * **Cyclical Order Quantities**
 - EOQ (Infinite and finite production rate)

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Safety Stock Inventory Factor

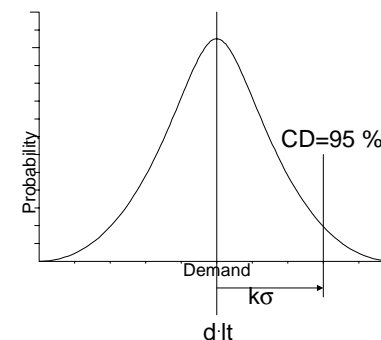
- * **Customer Service Measured by:**
 - Probability of Stockout (Type 1, α)
 - Fraction Delivered from Inventory (Type 2, β)
- * **Common Rule of Thumb:**
Safety Inventory Equals Time Length Multiplied by Demand (Linear Policy)
- * **Lead Time:** Time From Placement to Arrival of Order

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Demand During Lead Time and Stockout Probability (Type 1)



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Reorder Point for Uncertain Demand (Sequential Decision)

- * Sequentially Determine Q then R
- * Approximation
- * z Derived from Probability In Stock during Lead Time (Type 1)

$$Q^* = \sqrt{\frac{2 \cdot D \cdot oc}{hc}}$$

$$s_{dlt} = s_d \sqrt{lt}$$

$$R^* = d \cdot lt + z \cdot s_{dlt}$$

$$\sigma_{dlt}^2 = \sum_1^{lt} \sigma_d^2$$

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Average Inventory and Total Cost (No Stockout Cost)

$$AI = CI + SI = \frac{Q}{2} + z \cdot s_{dlt}$$

$$TC = \frac{D}{Q} oc + hc \frac{Q}{2} + hc \cdot z \cdot s_{dlt}$$

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Inventory Policies Comparison: Type 1 Service Level, $F(R) < \alpha$

$$Q^* = \sqrt{\frac{2 \cdot D \cdot oc}{hc}} \quad Q = \sqrt{\frac{2 \cdot 200 \cdot 50}{0.2 \cdot 10}} = 100$$

$$s_{dlt} = s_d \sqrt{LT} \quad s_{dlt} = \sqrt{0.5} \cdot 35.4 = 25$$

$$R^* = d \cdot LT + z \cdot s_{dlt} \quad R = 200 \cdot 0.5 + 2.05 \cdot 25 = 151$$

$$TC = \frac{D}{Q} oc + hc \frac{Q}{2} + hc \cdot z \cdot s_{dlt}$$

$$TC = \left(\frac{100}{2} + 2.05 \cdot 25 \right) 0.2 \cdot 10 + \frac{200}{100} 50 = 303$$

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Inventory Policies Comparison Example: Results

Type	Q	R	SI	AI	TC
Deterministic Demand	100	0	0	50	200.0
+ Lead Time	100	100	0	50	200.0
Stochastic Demand	100	151	51	101	302.0
Shortage Cost (Seq)	100	151	51	101	311.2
Shortage Cost (Iter)	111	143	43	99	308.5
Type 2 Service (Seq)	100	126	26	76	252.0
Type 2 Service (Iter)	114	124	24	81	249.5
SL2 (Iter) + Stoc. Lead Time	119	139	39	99	281.5

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Expected Units Out of Stock: Unit Normal Loss Function

$$n(R) = \int_R^{\infty} (x - R) f(x) dx$$

$$L(z) = \int_z^{\infty} (t - z) \phi(t) dt$$

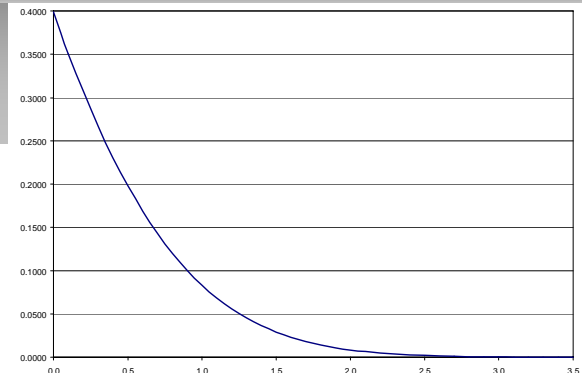
$$n(R) = s_{dlt} L\left(\frac{R - d \cdot LT}{s_{dlt}}\right) = s_{dlt} \cdot L(z)$$

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Unit Loss Function



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Total Cost for Uncertain Demand (Known Shortage Cost)

$$TC(Q) = \frac{D}{Q} oc + hc \frac{Q}{2} + hc \cdot z \cdot s_{dlt} +$$

$$\frac{D}{Q} sc \cdot s_{dlt} \cdot L(z)$$

$$TC(Q, R) = \frac{D}{Q} (oc + sc \cdot s_{dlt} \cdot L(z)) +$$

$$hc \left(\frac{Q}{2} + R - d \cdot LT \right)$$

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Inventory Policy Comparison: Known Stockout Costs

$$TC(Q, R) = \frac{D}{Q} (oc + sc \cdot s_{dlt} \cdot L(z)) +$$

$$hc \left(\frac{Q}{2} + R - d \cdot LT \right)$$

$$TC = \frac{200}{100} (50 + 25 \cdot 25 \cdot 0.0073) +$$

$$= 10 \cdot 0.2 \left(\frac{100}{2} + 151 - 200 \cdot 0.5 \right) = 312$$

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Inventory Policies Comparison Example: Results

Type	Q	R	SI	AI	TC
Deterministic Demand	100	0	0	50	200.0
+ Lead Time	100	100	0	50	200.0
Stochastic Demand	100	151	51	101	302.0
Shortage Cost (Seq)	100	151	51	101	311.2
Shortage Cost (Iter)	111	143	43	99	308.5
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SL2 (Iter) + Stoc. Lead Time	119	139	39	99	281.5

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Optimal Q and R (Iterative Method)

- * Start with Q Determined by EOQ
- * Determine Q and R Iteratively until No Further Change

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Iterative Formulas for Determination of Q and R

$$Q = \sqrt{\frac{2D[oc + sc \cdot n(R)]}{hc}}$$

$$= \sqrt{\frac{2D[oc + sc \cdot s_{dt} \cdot L(z)]}{hc}}$$

$$P_{in\text{stock}} = F(R) = \int_0^R f(x)dx$$

$$= 1 - \frac{Q \cdot hc}{sc \cdot D}$$

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Type 1 Service Level Iterations

Q	F(R)	z	R	L(z)	n(R)
100.0	0.9600	1.7507	143.8	0.0161	0.4037
109.6	0.9561	1.7076	142.7	0.0179	0.4487
110.7	0.9557	1.7033	142.6	0.0181	0.4536
110.8	0.9557	1.7028	142.6	0.0182	0.4541
110.8	0.9557	1.7027	142.6	0.0182	0.4542

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Inventory Policies Comparison Example: Results

Type	Q	R	SI	AI	TC
Deterministic Demand	100	0	0	50	200.0
+ Lead Time	100	100	0	50	200.0
Stochastic Demand	100	151	51	101	302.0
Shortage Cost (Seq)	100	151	51	101	311.2
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SL2 (Iter) + Stoc. Lead Time	119	139	39	99	281.5

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Service Level Type 2 or Fill Rate

- * Ratio of Long Range Expected Total Units Delivered out of Inventory Over Total Demand
- * Complement of Expected Total Units Out of Stock Over Total Demand D
- * Expected Units Out of Stock per Cycle $n(R)$

$$SL = 1 - \frac{(D/Q)n(R)}{D} = 1 - \frac{n(R)}{Q}$$

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Inventory Comparison Type 2 Service (Sequential)

$$Q = \sqrt{\frac{2 \cdot oc \cdot D}{hc}} \quad Q = \sqrt{\frac{2 \cdot 200 \cdot 50}{0.2 \cdot 10}} = 100$$

$$L(z) = \frac{Q(1 - SL)}{s_{dt}} \quad L(z) = \frac{100(1 - 0.98)}{25} = 0.08$$

$$R = d \cdot LT + z \cdot s_{dt} \quad z = 1.02$$

$$R = 200 \cdot 0.5 + 1.02 \cdot 25 = 126$$

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Inventory Comparison Cost: Type 2 Service (Sequential)

$$AI = CI + SI = \frac{Q}{2} + z \cdot s_{dt}$$

$$TC = \frac{D}{Q} oc + hc \frac{Q}{2} + hc \cdot z \cdot s_{dt}$$

$$TC = \left(\frac{100}{2} + 1.02 \cdot 25 \right) 0.2 \cdot 10 + \frac{200}{100} 50 = 251$$

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Inventory Policies Comparison Example: Results

	A	B	C	D	E	F
1 Type		Q	R	SL	AI	TC
2 Deterministic Demand		100	0	0	50	200.0
3 + Lead Time		100	100	0	50	200.0
4 Stochastic Demand		100	151	51	101	302.0
5 Shortage Cost (Seq)		100	151	51	101	311.2
6 Shortage Cost (Iter)		111	143	43	99	308.5
7 Type 2 Service (Seq)		100	126	26	76	252.0
8 Type 2 Service (Iter)		114	124	24	81	249.5
9 SL2 (Iter) + Stoc. Lead Time		119	139	39	99	281.5

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Optimal Q and R (Iterative Method) Type 2 Service

- * Start with Q Determined by EOQ
- * Determine Q and R Iteratively until No Further Change

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Iterative Formulas for Q and R Type 2 Service

$$Q_i = \sqrt{\frac{2 \cdot oc \cdot D}{hc}}$$

$$Q = \frac{n(R)}{1 - F(R)} + \sqrt{\frac{2 \cdot oc \cdot D}{hc} + \left(\frac{n(R)}{1 - F(R)} \right)^2}$$

$$L(z) = \frac{Q(1 - SL)}{s_{dlt}}$$

$$R = d \cdot LT + z \cdot s_{dlt}$$

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Type 2 Service Level Iterations

	J	K	L	M	N	O
70 Q		n(R)	L(z)	z	R	F(R)
71	100.0	2.00	0.0800	1.0210	125.5	0.8464
72	113.9	2.28	0.0911	0.9525	123.8	0.8296
73	114.3	2.29	0.0914	0.9507	123.8	0.8291
74	114.3	2.29	0.0914	0.9507	123.8	0.8291

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Inventory Comparison Cost: Type 2 Service (Iterative)

$$AI = CI + SI = \frac{Q}{2} + z \cdot s_{dlt}$$

$$TC = \frac{D}{Q} oc + hc \frac{Q}{2} + hc \cdot z \cdot s_{dlt}$$

$$TC = \left(\frac{114}{2} + 0.95 \cdot 25 \right) 0.2 \cdot 10 + \frac{200}{114} 50 = 249$$

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Inventory Policies Comparison Example: Results

	Q	R	SI	AI	TC
1 Type					
2 Deterministic Demand	100	0	0	50	200.0
3 + Lead Time	100	100	0	50	200.0
4 Stochastic Demand	100	151	51	101	302.0
5 Shortage Cost (Seq)	100	151	51	101	311.2
6 Shortage Cost (Iter)	111	143	43	99	308.5
7 Type 2 Service (Seq)	100	126	26	76	252.0
8 Type 2 Service (Iter)	114	124	24	81	249.5
9 SL2 (Iter) + Stoc. Lead Time	119	139	39	99	281.5

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Demand and Lead Time Uncertainty

* Lead Time over the Total Supply Chain

$$SI = z \cdot s_{dlt} = z \cdot \sqrt{lt \cdot Var_d + d^2 \cdot Var_{lt}}$$

$$CV_d = \frac{\sqrt{Var_d}}{d}$$

$$Var_d = (CV_d \cdot d)^2$$

$$SI = z \cdot \sqrt{lt \cdot CV_d^2 + Var_{lt}} \cdot d$$

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Standard Deviation of the Demand During the Lead Time

$$s_{dlt} = \sqrt{lt \cdot Var_d + d^2 \cdot Var_{lt}}$$

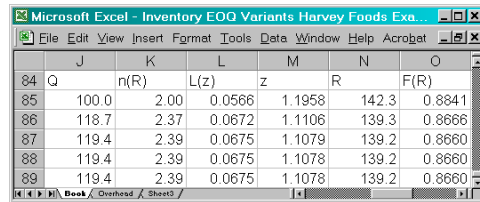
$$s_{dlt} = \sqrt{0.5 \cdot 35.4^2 + 200^2 \cdot 0.125^2} = 35.4$$

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Stochastic Lead Time and Service Level Type 2 Iterative



	J	K	L	M	N	O
84	Q	n(R)	L(z)	z	R	F(R)
85	100.0	2.00	0.0566	1.1958	142.3	0.8841
86	118.7	2.37	0.0672	1.1106	139.3	0.8666
87	119.4	2.39	0.0675	1.1079	139.2	0.8660
88	119.4	2.39	0.0675	1.1078	139.2	0.8660
89	119.4	2.39	0.0675	1.1078	139.2	0.8660

$$TC = \frac{D}{Q} oc + hc \frac{Q}{2} + hc \cdot z \cdot s_{dl}$$

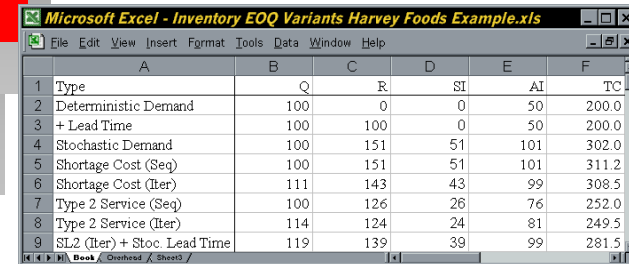
$$TC = \left(\frac{119}{2} + 1.11 \cdot 35.4 \right) 0.2 \cdot 10 + \frac{200}{119} 50 = 282$$

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Inventory Policies Comparison Example: Results



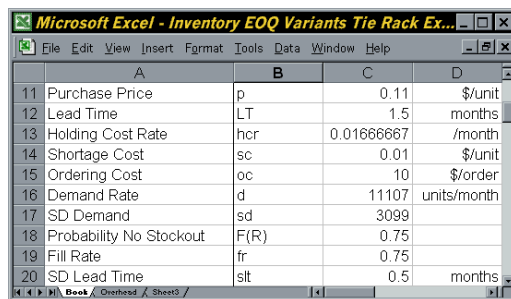
	A	B	C	D	E	F
1	Type	Q	R	SI	AI	TC
2	Deterministic Demand	100	0	0	50	200.0
3	+ Lead Time	100	100	0	50	200.0
4	Stochastic Demand	100	151	51	101	302.0
5	Shortage Cost (Seq)	100	151	51	101	311.2
6	Shortage Cost (Iter)	111	143	43	99	308.5
7	Type 2 Service (Seq)	100	126	26	76	252.0
8	Type 2 Service (Iter)	114	124	24	81	249.5
9	SL2 (Iter) + Stoc. Lead Time	119	139	39	99	281.5

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Inventory Policies Comparison Exercise: Data



	A	B	C	D
11	Purchase Price	p	0.11	\$/unit
12	Lead Time	LT	1.5	months
13	Holding Cost Rate	hcr	0.01666667	/month
14	Shortage Cost	sc	0.01	\$/unit
15	Ordering Cost	oc	10	\$/order
16	Demand Rate	d	11107	units/month
17	SD Demand	sd	3099	
18	Probability No Stockout	F(R)	0.75	
19	Fill Rate	fr	0.75	
20	SD Lead Time	slt	0.5	months

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Inventory Systems Overview

- 1 Introduction
- 2 Independent Demand Systems
 - Continuous Review
 - Periodic Review
- 3 Dependent Demand Systems

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Periodic Review Inventory Systems

- * Review at Fixed Intervals & Schedule
- * Joint Ordering, Transportation, and Production Economies
- * Simple Manual Implementation
- * Reduced Administration Cost
- * Slightly Higher Inventory Cost Compared to Continuous Review

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Periodic Review (s,S) Policies

- * Definitions
 - i = on hand inventory
 - s = ordering trigger level
 - S = order up to level
- * Policy

if $i \leq s$ order $S - i$
 if $i > s$ do not order

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Periodic Review Inventory Policies

- * Optimal Inventory Policies have Very Complex Derivations
 - * Simple Approximations have Acceptable Accuracy
- $$s \approx R$$
- $$S \approx R + Q$$

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Inventory Systems Overview

- 1 Introduction
- 2 Independent Demand Systems
- 3 Dependent Demand Systems

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Distribution Requirements Planning (DRP)

- * Integrated Supply Scheduling Throughout Supply Chain
- * MRP for Supply Chain
- * Forecasted Demand for Products Delivered to Customers
- * Bill of Materials (BOM) [a_{qp}]

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Material Requirements Planning (MRP)

- * Precise Timing of Material Flows to meet Production Planning
- * Avoid Carrying Items as Work-In-Process (WIP) Inventory
- * Scheduling of High-Value, Custom-Made Items
- * When Demand is Reasonably Well Known

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DRP Advantages

- * Requires uniform and consistent data collection
- * Advance planning for future demands
- * New and irregular demands
- * Uniform product shortage allocation
- * Incorporate other planned demands
- * Balance facility utilization
- * Control and balance obsolescence

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Clock MRP Example: K36 Demand

	Week	0	1	2	3	4	5	6	7	8
K36										
Gross Demand			100	150	120	150	100	90	110	120
Receipts										
Quantity on Hand		400								
Production Start										

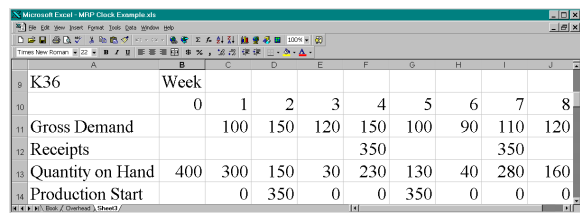
Q=350
LT=2

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Clock MRP Example: K36 Schedule



	Week	0	1	2	3	4	5	6	7	8
Gross Demand			100	150	120	150	100	90	110	120
Receipts						350			350	
Quantity on Hand		400	300	150	30	230	130	40	280	160
Production Start		0	350	0	0	350	0	0	0	0

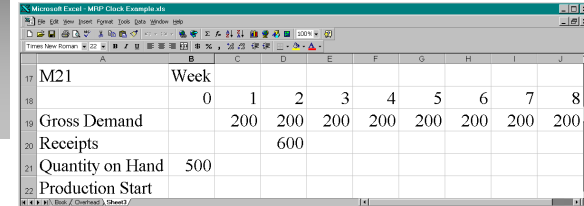
Q=350
LT=2

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Clock MRP Example: M21 Demand



	Week	0	1	2	3	4	5	6	7	8
Gross Demand			200	200	200	200	200	200	200	200
Receipts				600						
Quantity on Hand		500								
Production Start										

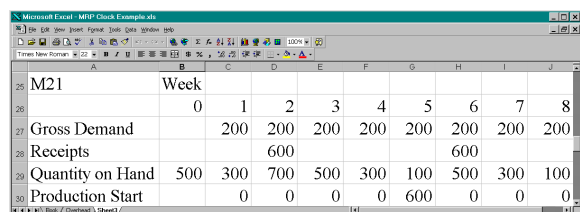
Q=600
LT=1

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Clock MRP Example: M21 Schedule



	Week	0	1	2	3	4	5	6	7	8
Gross Demand			200	200	200	200	200	200	200	200
Receipts				600			600			
Quantity on Hand		500	300	700	500	300	100	500	300	100
Production Start		0	0	0	0	600	0	0	0	0

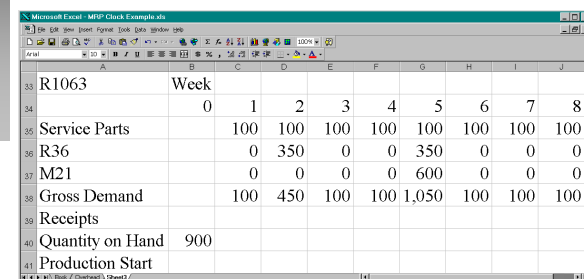
Q=600
LT=1

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Clock MRP Example: R1063 Demand



	Week	0	1	2	3	4	5	6	7	8
Gross Demand			100	100	100	100	100	100	100	100
Receipts										
Quantity on Hand		900								
Production Start										

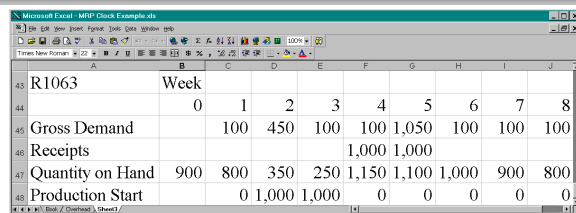
Q=1000, LT=2, SS=250

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Clock MRP Example: R1063 Schedule



	Week	0	1	2	3	4	5	6	7	8
Gross Demand			100	450	100	100	1,050	100	100	100
Receipts						1,000	1,000			
Quantity on Hand		900	800	350	250	1,150	1,100	1,000	900	800
Production Start			0	1,000	1,000	0	0	0	0	0

Q=1000
LT=2
SS=250

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Bill of Material Matrix

* # Immediate Components q Required to Produce 1 Unit of Product $p = A_{qp}$

- Rows = Components q
- Columns = Products p

$$A_{qp} = \begin{bmatrix} & \\ & \\ & \end{bmatrix}$$

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DRP (MRP) Inventory Equation

* Notation

- OHI = On-Hand Inventory
- d = gross requirements (outflow)
- s = scheduled receipts (inflow)
- r = planned production receipts (inflow)

$$OHI_{p,t} = OHI_{p,t-1} - d_{p,t} + s_{p,t} + r_{p,t}$$

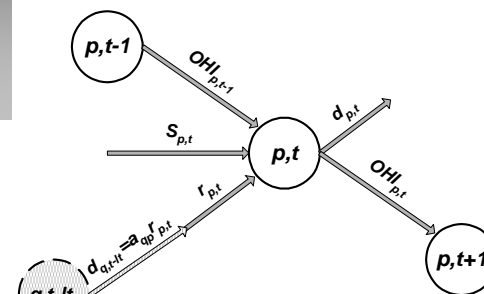
$$d_{q,t-lt_p} = a_{qp} r_{p,t}$$

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DRP Inventory Transition Diagram



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DRP (MRP) Characteristics

- * Strongly Dependent on Quality and Stability of Final Product Forecast
 - Forecast changes/errors create WIP
- * Uncapacitated (No Manufacturing or Transportation Resources)
 - Basic equations are deterministic
- * Can Accommodate Irregular Demand

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DRP (MRP) Implementation Details

- * Production Quantity
 - First cut heuristic approximation by EOQ
 - More Sophisticated Algorithms
 - Silver-Meal heuristic
 - Wagner-Whitin (optimal dynamic programming)
- * Safety Inventory
 - Newsboy Methodology

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Supply Chain and Warehousing Trends

**Inventory
Facilities
Handling**



**Transactions
Transportation
Information**

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