



λ - Demand rate

K - Fixed cost

c - cost per unit (variable cost)

h - Holding Cost rate

Q - Order Quantity

$G(Q)$ - Average annual cost (as a function of Q)

T - Cycle time

$g(T)$ - Average annual cost (as a function of T)

$$Q = \lambda \cdot T \leftrightarrow T = \frac{Q}{\lambda}$$

$$G(Q) = \frac{K + cQ + h \cdot (\frac{1}{2}QT)}{T}$$

Total Cost: $K + cQ + h \cdot (\frac{1}{2}QT)$

עלות כוללת
כוללת

$$T = \frac{Q}{\lambda}$$

$$G(Q) = \frac{K + cQ + h \cdot \frac{1}{2} \cdot Q \cdot \frac{Q}{\lambda}}{\frac{Q}{\lambda}} = \frac{K\lambda}{Q} + c\lambda + \frac{hQ}{2}$$

העלות הנמוכה ביותר תהיה כש-0

$$G'(Q) = -\frac{K\lambda}{Q^2} + \frac{h}{2} = 0 \Rightarrow Q^* = \sqrt{\frac{2K\lambda}{h}} \quad T = \frac{Q}{\lambda}$$

$$\Rightarrow T^* = \sqrt{\frac{2K}{\lambda h}}$$

זמן ההתקנה אינו תלוי ב- c

$$G(Q^*) = \sqrt{2K\lambda h}$$

τ - Lead time

R - Reorder Point : net inventory level when ordering

(Q, R) - Ordering Policy : order a fixed quantity Q every time the inventory is at or below R . If $\tau < T \Rightarrow R = \lambda\tau$

When $\tau > T$: $R = \lambda \cdot \tau_r$ ($\tau_r = \tau - m \cdot T$) $m = \lfloor \frac{\tau}{T} \rfloor$

For finite Production Rate : $H = (P - \lambda)T_1 \Rightarrow H = (P - \lambda) \left(\frac{Q}{P}\right)$

$\Rightarrow H = Q \left(1 - \frac{\lambda}{P}\right)$ H - Maximum level of on-hand Inventory

Holding Cost: $h \cdot (\frac{1}{2} \cdot H \cdot T) = h \cdot \frac{1}{2} \cdot Q (1 - \frac{\lambda}{P}) T$
 Define $h' = h (1 - \frac{\lambda}{P}) \Rightarrow$ Holding cost $= h' \cdot \frac{1}{2} Q T$

$$Q^* = \sqrt{\frac{2K\lambda}{h'}} = \sqrt{\frac{2K\lambda}{h(1-\frac{\lambda}{P})}}$$

When Backorders allowed

- \hat{P} - backorder cost rate (Per time unit)
- P - backorder cost per unit
- B - Maximum backorder level (units)

$$\left(\begin{array}{l} B = T_1 (P - \lambda) \\ T_1 = \frac{B}{P - \lambda} \end{array} \right) \quad \left(\begin{array}{l} H = T_2 (P - \lambda) \\ T_2 = \frac{H}{P - \lambda} \end{array} \right) \quad \left(\begin{array}{l} H = T_3 \cdot \lambda \\ T_3 = \frac{H}{\lambda} \end{array} \right)$$

$$\left(\begin{array}{l} B = T_4 \cdot \lambda \\ T_4 = \frac{B}{\lambda} \end{array} \right)$$

$$T_1 + T_2 = \frac{Q}{P}$$

$H = Q - B - (T_1 + T_2) \lambda$: Inventory is what you produce minus what you use.
 $= Q - B - \frac{Q}{P} \lambda = Q (1 - \frac{\lambda}{P}) - B$

$H = -B + (T_1 + T_2) (P - \lambda)$: Inventory is where you started plus what you put in
 $= -B + \frac{Q}{P} (P - \lambda) = Q (1 - \frac{\lambda}{P}) - B$

order cost
 K per cycle

Inventory cost

$$h \cdot \frac{1}{2} \cdot (T_2 + T_3) \cdot H = h \cdot \frac{1}{2} \cdot \left(\frac{H}{P - \lambda} + \frac{H}{\lambda} \right) \cdot H =$$

$$= \frac{1}{2} \cdot h \cdot \left(\frac{H \cdot \lambda + H(P - \lambda)}{\lambda(P - \lambda)} \right) \cdot H = \frac{1}{2} \cdot h \cdot \frac{HP}{\lambda(P - \lambda)} \cdot H =$$

$$= \frac{1}{2} \cdot h \cdot \frac{H^2}{(1 - \frac{\lambda}{P}) \lambda}$$



Shortage cost

$$\frac{1}{2} \hat{p} \cdot \frac{B^2}{(1 - \frac{\lambda}{p})\lambda} \quad \text{Time and quantity dependent}$$

P.B Quantity dependent

$$G(Q) = \frac{K + \frac{1}{2}h \cdot \frac{H^2}{(1 - \frac{\lambda}{p})\lambda} + \frac{1}{2}\hat{p} \cdot \frac{B^2}{(1 - \frac{\lambda}{p})\lambda} + P \cdot B}{T} \quad \text{with } \lambda \text{ and } p \text{ in } T$$

$$Q^* = \sqrt{\frac{2K\lambda}{h(1 - \frac{\lambda}{p})} - \frac{(P\lambda)^2}{h(h + \hat{p})}} \cdot \sqrt{\frac{h + \hat{p}}{\hat{p}}}$$

$$B^* = \frac{(hQ^* - P\lambda) \cdot (1 - \frac{\lambda}{p})}{h + \hat{p}}$$

$$\text{Fill rate} = \frac{Q - B}{Q}$$

Reorder point: $R = \lambda\tau - B$
if $P = \infty \Rightarrow R = \lambda\tau$

Sensitivity

$$\frac{G(Q^A)}{G(Q^*)} = \frac{1}{2} \left[\frac{Q^*}{Q^A} + \frac{Q^A}{Q^*} \right]; \quad \frac{g(T^A)}{g(T^*)} = \frac{1}{2} \left[\frac{T^*}{T^A} + \frac{T^A}{T^*} \right]$$

Which Way to round?

If you need to choose between $Q_1 < Q^*$
 $Q_2 > Q^*$

Choose the one that has smaller geometric deviation.

$$\frac{Q^*}{Q_1} \text{ or } \frac{Q_2}{Q_1}$$

Midpoint is where the two are equal

$$\frac{Q_m}{Q_1} = \frac{Q_2}{Q_m} \Rightarrow Q_m = \sqrt{Q_1 Q_2}$$

Geometric Average

EOQ Power of Two

Orders can only be placed once a unit time

Allowable reorder intervals are $T^{PO2} (1, 2, 4, 8, 16, 32, \dots)$

Quantity Discounts



Interval - Quantities for which the unit cost is unchanged

m - Number of intervals (numbered $0, 1, \dots, m-1$)

C_j - Unit cost for interval j ($C_0 > C_1 > C_2 > \dots > C_{m-1}$)

b_j - Breakpoint j - Beginning of interval j

$$0 = b_0 < b_1 < b_2 < \dots < b_{m-1} < b_m = \infty$$

$G_j(Q)$ - average annual cost as a function of Q given that Q falls within interval j .

Plan of attack

- Look at each interval separately

Find $Q^{(j)EOQ}$, the unconstrained optimal value for interval j . [Use $Q^{(j)EOQ}$ to find $Q^{(j)*}$]

$$b_j \leq Q^{(j)EOQ} \leq b_{j+1} \Rightarrow Q^{(j)*} = Q^{(j)EOQ}$$

$$Q^{(j)EOQ} \leq b_j \leq b_{j+1} \Rightarrow Q^{(j)*} = b_j$$

$$b_j \leq b_{j+1} \leq Q^{(j)EOQ} \Rightarrow Q^{(j)*} = b_{j+1}$$

$$\frac{C(Q)}{Q^*}$$

- Find the optimal order quantity by comparing the optimal value for the different intervals.

Quantity Discounts - Holding costs

$h = IC + W \frac{C(Q)}{Q}$ Depends on $Q \Rightarrow$ Holding cost rate is a function of Q .

$$h(Q) = I \cdot \frac{C(Q)}{Q} + W$$

Define: $h_j = IC_j + W$

For All units Discount:

In each interval j find $Q^{(j)EOQ}$

$$G_j(Q) = \frac{C(Q) + K + h(Q) \cdot \frac{1}{2} \cdot J \cdot Q}{J} \quad J = \frac{Q}{\lambda}$$
$$= \frac{C(Q)}{Q} \cdot \lambda + \frac{K\lambda}{Q} + \frac{[I \cdot C(Q) + W] \cdot Q}{2}$$

$$= C_J \lambda + \frac{C(Q)}{Q} + \frac{k\lambda}{Q} + \frac{[IC_J + W]Q}{2} =$$

$$= C_J \lambda + \frac{k\lambda}{Q} + \frac{h_J Q}{2} \Rightarrow Q^{(j)EOQ} = \sqrt{\frac{2k\lambda}{h_j}}$$

Incremental Discount

For each interval j find $Q^{(j)EOQ}$

$$G_j(Q) = \frac{C(Q) + k + h(Q) \cdot \frac{1}{2} J \cdot Q}{J} =$$

$$= \frac{[C(b_j) + C_j \cdot (Q - b_j)]}{Q} \cdot \lambda + \frac{k\lambda}{Q} +$$

$$+ \frac{[I \cdot \frac{C(b_j) + C_j(Q - b_j)}{Q} + W] \cdot Q}{2} =$$

$$= C_j \lambda + \frac{[C(b_j) - C_j b_j]}{Q} \lambda + \frac{k\lambda}{Q} + \frac{I[C(b_j) + C_j(Q - b_j)] + WQ}{2}$$

$$= C_j \lambda + \frac{I[C(b_j) - C_j b_j]}{2} + \frac{[k + C(b_j) - C_j b_j] \lambda}{Q} + \frac{h_j Q}{2}$$

$$\Rightarrow Q^{(j)EOQ} = \sqrt{\frac{2\lambda(k + C(b_j) - C_j b_j)}{h_j}}$$

Deterministic Demand Discrete Time

n - number of periods in the planning horizon

r_i - requirements (demand) in period i (λ_i)

y_i - amount to order (lot size) in period i (Q_i)

I_i - inventory held from period i to period $i+1$

I_0 - initial inventory ($h_0 = 0$)

T - number of periods covered with a certain order (Silver-Meal)

Network Flow

• In each period i units can become available from

→ Production in period i

→ Inventory from period $i-1$



- in each period i , units can be used for
 - Demand in period i
 - Inventory for period $i+1$

Total Production $\sum_1^n y_i$ must equal total demand $\sum_1^n r_i$

$$I_0 = 0$$

$$I_n = 0$$

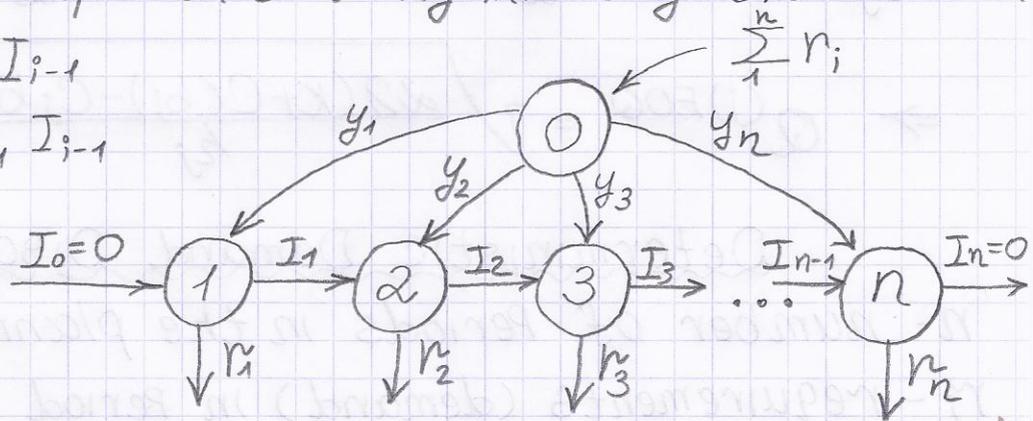
Representation as a Network Flow

[Node 0 \Leftrightarrow Total production
Flow in is $\sum_1^n r_i$

[Node i represents period i
Flow out is r_i

[Arc $(0, i)$ represents production in period i
Flow in is I_i
Cost is $(0 \text{ or } K_i + C_i y_i)$

[Arc $(i-1, i)$ represents holding inventory from period $i-1$
Flow in is I_{i-1}
Cost is $h_{i-1} I_{i-1}$



MIP Representation

$\delta_i = \begin{cases} 1 & \text{if } y_i > 0 \\ 0 & \text{if } y_i = 0 \end{cases}$ indicator variable indicating if production takes place in period i

$$\text{Min } \sum_1^n (K_i \delta_i + C_i y_i + h_{i-1} I_{i-1})$$

$$\text{s.t. } \sum_1^n r_i = \sum_1^n y_i$$

$$I_i, y_i \geq 0$$

$$I_{i-1} + y_i = r_i + I_i$$

$$\delta_i \in \{0, 1\}$$

$$I_0 = I_n = 0$$

$$M = \sum_1^n r_i$$

$$y_i \leq M \delta_i$$

Solution Methods



• Heuristics

→ Lot for Lot (LFL)

→ Silver-Meal

• Optimal algorithm

→ Wagner Whiten (WW)

→ Zangwill (Include shortages)

All satisfy
Zero ordering

Lot for Lot

Produce each Period exactly the requirement for that Period

Minimizes inventory costs \leftrightarrow Maximizes fixed order costs

Silver - Meal

Start at Period 1 by examining an order for one Period

→ Calculate the average holding and setup cost Per Period

$C(T)$ if ordered for T Periods

Variable order cost is constant \rightarrow not considered

→ Increase the order one Period and recalculate

→ Stop when average cost Per Period begins to increase

→ Order enough to cover demand for $T-1$ Periods

$$C(T) = \frac{1}{T} \cdot [K + h \cdot r_2 + 2h \cdot r_3 + \dots + (T-1)h \cdot r_T]$$

if $C(T-1) > C(T)$ then $T = T+1 \dots$

Set $y_1 = r_1 + \dots + r_{T-1}$ and $y_2 = \dots = y_{T-1} = 0$

Wagner Whiten (Optimal Algorithm)

In Period 1 produce enough to last until Period j ($r_1 + \dots + r_{j-1}$)

j goes from 2 to $n+1$

Period $n+1$ signifies the end of the world

The cost for each path is: $C_{ij} = K_i + C_j \sum_{m=i}^{j-1} r_m + \sum_{m=j+1}^{j-1} \left[r_m \sum_{s=j}^{m-1} h_s \right]$

$$= K_i + C_i \sum_{m=i}^{J-1} r_m + \sum_{s=i}^{J-2} \left[h_s \sum_{m=s+1}^{J-1} r_m \right]$$



Dynamic Programming

f_k - min cost of starting period k with zero inventory and supplying all requirements until the end of the world.

$$f_k = \min_{k+1 \leq J \leq n+1} (C_{kJ} + f_J)$$

$$f_{n+1} = 0 \quad (\text{Initial condition})$$

Zangwill

$$C_i(y_i) = K_i \cdot \delta_i + C_i y_i$$

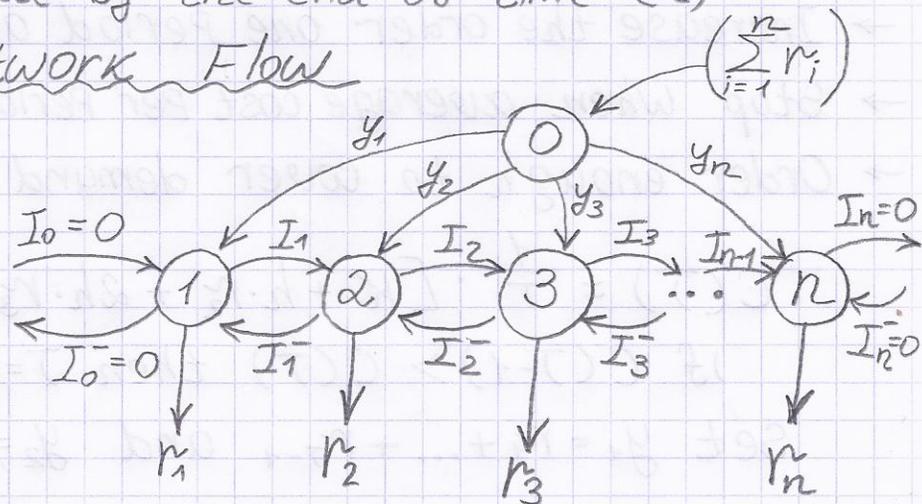
→ Shortages are allowed $C_{iJ} = C_i \left(\sum_{m=1}^{J-1} r_m \right) + \sum_{s=i}^{J-2} H_s \left(\sum_{m=s+1}^{J-1} r_m \right)$

→ $I_i^- \rightsquigarrow$ amount of shortage (unsatisfied demand) ←

$S_i(I_i^-)$ - cost of having I_i^- units of unsatisfied demand at the end of period i

→ All shortages satisfied by the end of time (n)

Network Flow



$$\min \sum_{i=1}^n \left(C_i(y_i) + H_i(I_i) + S_i(I_i^-) \right)$$

$$\text{s.t.} \quad \sum_{i=1}^n r_i = \sum_{i=1}^n y_i$$

$$I_0^- = I_n^- = 0$$

$$I_{j-1} + y_j + I_j^- = r_j + I_j + I_{j-1}^-$$

$$I_j, y_j, I_j^- \geq 0$$

$$I_0 = I_n = 0$$

Stochastic Demand Discrete Time



One Period model

V - selling price per unit

C - purchase cost per unit

h - holding cost per unit (-1 · salvage value)

P - shortage cost per unit (above lost sale)

D - continuous random variable representing demand with known distribution.

d - instance / realization of D

Q - order quantity

C_o - overage cost per unit = $C + h \leftarrow \text{Prob}(D < Q) = F(Q)$

C_u - underage cost per unit = $(V - C) + P \leftarrow \text{Prob}(D > Q) = 1 - F(Q)$

$$C_u \cdot (1 - F(Q^*)) = C_o \cdot F(Q^*) \Rightarrow F(Q^*) = \frac{C_u}{C_u + C_o} \leftarrow \text{Critical Ratio}$$

$G(Q, d)$ - Overage and underage cost at the end of the period when Q units are ordered and the demand is d .

$$G(Q) = E_D [G(Q, d)]$$

$$G(Q, d) = C_o (Q - d)^+ + C_u (d - Q)^+$$

$$G(Q) = E_D [G(Q, d)] = \int_0^{\infty} G(Q, d) \cdot f(d) dd$$

$$\begin{aligned} G(Q) &= C_o \int_0^{\infty} (Q - d)^+ \cdot f(d) dd + C_u \int_0^{\infty} (d - Q)^+ \cdot f(d) dd = \\ &= C_o \int_0^Q (Q - d) \cdot f(d) dd + C_u \int_Q^{\infty} (d - Q) \cdot f(d) dd \end{aligned}$$

Service

α - no stock-out probability

β - Fill rate ~ Percentage of demand filled off-the-shelf

Evaluation of Shortage^P cost using α

- No stock-out Probability set to α by management

Given V, c, h and α calculate P .

$$\alpha = F(Q^*) = \frac{C_u}{C_u + C_o} = \frac{P + V - c}{(P + V - c) + (c + h)} = \frac{P + V - c}{P + V + h}$$

$$\alpha \cdot (P + V + h) = P + V - c$$

$$\alpha(V + h) - (V - c) = P(1 - \alpha)$$

$$P = \frac{\alpha h + c - (1 - \alpha)V}{1 - \alpha} = \frac{\alpha h + c}{1 - \alpha} - V$$

Initial Inventory

u - starting inventory

Q - order quantity

S - order-up-to quantity

$$S = Q + u$$

S^* - desired order-up-to quantity

S^* is independent of u

S^* = Optimal order quantity without Initial inventory

$G(S)$ - Expected cost (overage and underage) above the right decision when ordering-up-to S units

$J(S)$ - Expected Profit when ordering-up-to S units

$$F(S^*) = \frac{C_u}{C_u + C_o}$$

Fixed Order Cost (s, S)



Prepared by Boris Milner

Indifference point: $J(u) = J(S^*) - K$

$$(V-c)\mu + C \cdot u - G(u) = (V-c)\mu + C \cdot u - G(S^*) - K$$

$$G(u) = G(S^*) + K$$

Define s^* as the smallest initial inventory u such that

$$G(s^*) - G(S^*) = K$$

When the net inventory at the start of the period is less than or equal to s , order to bring the inventory up to S .

Infinite horizon (S)

n - number of periods

d_i - instance/realization of D in period i

S - Order-up-to level in each period

h - holding cost per unit in stock at the end of the period

→ No salvage value because the world does not end

P - Shortage cost per unit (loss of good will)

→ All shortages satisfied the very next period

Critical Ratio

$$\text{Backorders: } F(S^*) = \frac{C_u}{C_u + C_o} = \frac{P}{P + h}$$

$$\text{Lost sales: } F(S^*) = \frac{C_u}{C_u + C_o} = \frac{V - c + P}{V - c + P + h}$$

Backorders

Expected Profit over n periods = $-C \cdot S + (V-c)(n-1)\mu + V \cdot E[\min(S, D_n)] - n \cdot L(S)$

$L(S) = h \int_0^S (S-d) f(d) dd + P \int_S^\infty (d-S) f(d) dd$

Let n grow without bound → Expected Profit Per Period

Divide by n and get Profit Per Period



Over infinite horizon, Expected Profit Per Period is

$(V-C)\mu - L(S)$ ← Profit of right decision - ^{cost above the} right decision.

$$F(S^*) = \frac{P}{P+h} = \frac{C_u}{C_u+C_o}$$

→ C may affect h

→ V may affect P

Lost Sales

Divide by n → expected Profit
 $n \rightarrow \infty \Rightarrow$ over infinite ^{per Period}
 horizon

Expected Profit over n periods is:

$$-C \cdot S + [n \cdot V - (n-1)c] \left[\mu - \int_S^{\infty} (d-S) f(d) dd \right] - nL(S)$$

over infinite horizon: $(V-C) \left[\mu - \int_S^{\infty} (d-S) f(d) dd \right] - L(S)$

$$F(S^*) = \frac{P+V-C}{P+V-C+h} = \frac{C_u}{C_u+C_o}$$

S^* is larger with lost sales than with Backorders.

Stochastic Demand Continuous Time

Base Stock - S

uncertain demand during supplier lead time

H - on-hand inventory (units)

B - Backorders (units)

I - Net inventory ($I = H - B$)

O - on-order inventory

X - Inventory Position ($X = I + O$)

τ - Lead time

D, d - Random Variable and instance of demand during lead-time τ ; D is continuous: $F(d), f(d), \mu, \sigma^2$

h - holding cost rate

S - base stock level

\hat{P} - backorder cost rate

$G(S)$ - expected cost per unit time using base stock level S .

$$S = X = (I + O)$$



- On-order inventory at time t (now) equals demand in the last τ time units $[t-\tau, t] \Leftrightarrow O = d$
- An order is placed together with each demand.
- Orders before time $t-\tau$ have already arrived
- Orders after time $t-\tau$ have not yet arrived.
- Number of orders between time $t-\tau$ and t is exactly D .

$$S = I + d \Rightarrow I = S - d \Rightarrow H - B = S - d \Rightarrow H = S - d + B$$

$$\begin{aligned}
 H &= (S - d)^+ && \rightarrow E[I] = S - \mu \\
 B &= (d - S)^+ && E[H] = S - \mu + E[B]
 \end{aligned}$$

Optimal Base Stock Policy

$$G(S) = h \cdot E[H] + \hat{p} \cdot E[B]$$

$$E[H] = \int_0^S (S - d) f(d) dd + \int_S^\infty 0 \cdot f(d) dd$$

$$E[B] = \int_0^S 0 \cdot f(d) dd + \int_S^\infty (d - S) f(d) dd$$

$$G(S) = h \cdot \int_0^S (S - d) f(d) dd + \hat{p} \int_S^\infty (d - S) f(d) dd$$

$$\frac{\partial G(S)}{\partial S} = h \cdot \int_0^S f(d) dd - \hat{p} \int_S^\infty f(d) dd \quad (\text{Leibniz's rule})$$

$$h \cdot F(S^*) - \hat{p} (1 - F(S^*)) = 0 \Rightarrow F(S^*) = \frac{\hat{p}}{h + \hat{p}}$$

Lot Size / Reorder Point (Q,R)



- When the inventory level reaches R (reorder point) order Q (order quantity) units.

- Shortage cost \gg holding cost

τ - Lead time

D - Random variable and an instance of demand during the lead time τ .

λ - Expected demand rate $\rightarrow \mu = \lambda \cdot \tau$

s - Safety stock ($s = R - E(D) = R - \lambda \tau$)

K - Fixed ordering cost

c - cost per unit

h - holding cost rate

P - backorder cost per unit

R - reorder point (units)

Q - Lot size (units)

T - average time between orders $T = \frac{Q}{\lambda}$

$G(Q,R)$ - average cost per unit time if using Q and R

Inventory holding cost (APPROX 1)

- Inventory level varies 'linearly' between s and $s+Q$.

$$\rightarrow s = E[R - D] = R - \lambda \tau$$

Expected holding cost per unit time (APPROX 1) is:

$$\frac{h \cdot \left(\frac{s + (s+Q)}{2} \right) \cdot T}{T} = h \cdot \left(\frac{Q}{2} + s \right) = h \cdot \left(\frac{Q}{2} + R - \lambda \tau \right)$$

Expected fixed cost per unit time depends on Q

$$\frac{K}{T} = \frac{K \lambda}{Q}$$

Expected number of stock-outs in a cycle: $n(R)$ 

$$n(R) = E[(D-R)^+] = \int_R^{\infty} (d-R) f(d) dd$$

- Shortage cost for a cycle is independent of Q : $P \cdot n(R)$
- Expected shortage cost per unit time depends on Q :

$$\frac{P \cdot n(R)}{T} = \frac{P \cdot n(R) \cdot \lambda}{Q}$$

- Expected cost per unit time (holding, setup and shortage)

$$G(Q, R) = h \left(\frac{Q}{2} + R - \lambda \tau \right) + K \cdot \frac{\lambda}{Q} + \frac{P \cdot \lambda \cdot n(R)}{Q}$$

$$\frac{\partial G}{\partial Q} = \frac{\partial G}{\partial R} = 0$$

$$Q^* = \sqrt{\frac{2\lambda[K + P \cdot n(R^*)]}{h}} \quad (a)$$

$$F(R^*) = \frac{P\lambda - hQ^*}{P \cdot \lambda} \quad (b)$$

Solution Procedure (Approx 1)

Iterating between equations (a) and (b) until two successive values of Q and R are the 'same'

$$Q^{\text{new}} = \sqrt{\frac{2K\lambda}{h}} \quad (a) \quad n(R) = 0$$

$$F(R^{\text{new}}) = \frac{P\lambda - h \cdot Q^{\text{new}}}{P \cdot \lambda} \Rightarrow R^{\text{new}} \quad (b)$$

$$Q^{\text{old}} = Q^{\text{new}}; R^{\text{old}} = R^{\text{new}}$$

repeat

$$Q^{\text{new}} = \sqrt{\frac{2\lambda[K + P \cdot n(R^{\text{old}})]}{h}} \quad (a)$$

$$F(R^{\text{new}}) = \frac{P\lambda - h \cdot Q^{\text{new}}}{P \cdot \lambda} \Rightarrow R^{\text{new}} \quad (b)$$

until $Q^{\text{old}} \approx Q^{\text{new}}$
 $R^{\text{old}} \approx R^{\text{new}}$

$$Q^* = Q^{\text{new}}; R^* = R^{\text{new}}$$

(APPROX 2)



- Inventory level varies 'linearly' between
→ The expected on-hand inventory before order arrives
 $E[(R-D)^+] = E[R-D+(D-R)^+] = R - \lambda \tau + n(R)$

- The expected net inventory after order arrives
 $S+Q = R - \lambda \tau + Q$

Expected average holding cost (APPROX 2) IS:

$$\frac{h \cdot \left(\frac{(S+n(R)) + (Q+S)}{2} \right) \cdot T}{T} = h \left(\frac{Q}{2} + S + \frac{n(R)}{2} \right)$$

- For the same Q and R , APPROX 2 reports a larger safety stock than APPROX 1.

$$Q^* = \sqrt{\frac{2\lambda [K + P \cdot n(R^*)]}{h}} \quad (a')$$

$$F(R^*) = \frac{P \cdot \lambda - \frac{Q^* \cdot h}{2}}{P \cdot \lambda + \frac{Q^* \cdot h}{2}} \quad (b')$$

Same iterations algorithms using a' and b' instead of a and b

- If demand follows a normal distribution $N(\mu, \sigma^2)$
→ $D \sim N(\tau \cdot \mu, \tau \cdot \sigma^2)$

Solution Procedure with Normal Distribution

If $D \sim N(\mu, \sigma^2)$

$n(R)$ is computed using the standardized loss function

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

$$n(R) = \sigma \cdot L\left(\frac{R-\mu}{\sigma}\right)$$

Multiple Items Single Stage



EOQ With Constraints

n - number of items

$C_i, K_i, h_i, \lambda_i, Q_i, T_i, G_i(Q_i)$ - like EOQ ($i = 1, \dots, n$)

W_i - space consumed by unit i

W - total space available

C - total budget available for inventory investment

Q_i^{EOQ} - order quantity as determined by the EOQ formula

$$Q_i^{EOQ} = \sqrt{\frac{2K_i\lambda_i}{h_i}}$$

Solution Approach

- Solve the problem with help of Lagrangian Multipliers.

θ^W - Lagrange multiplier for the space constraint

θ^C - Lagrange multiplier for the budget constraint

Space constraint

$$\min \sum_{i=1}^n G_i(Q_i) = \sum_{i=1}^n \left(\frac{h_i Q_i}{2} + \frac{K_i \lambda_i}{Q_i} \right)$$

Subject to: $\sum_{i=1}^n W_i Q_i \leq W$

$$Q_i \geq 0$$

If $\sum_{i=1}^n W_i Q_i^{EOQ} \leq W$, then $Q_i^* = Q_i^{EOQ}$ and go no further.

If $\sum_{i=1}^n W_i Q_i^{EOQ} > W$, then some Q_i^{EOQ} 's must be reduced.

Lagrange Multiplier

- Call the dual variable for the constraint θ^W

• θ^{W*} is the decrease in the average cost that would result from adding an additional unit of resource Marginal Benefit

interpret θ^w in 3 different ways:

- How much willing to pay to expand the warehouse
- Charge the parts for using our space
- Charge ourselves for violating the constraint

The new target function

find θ^w and Q_1, Q_2, \dots, Q_n to solve the problem:

$$\max_{\theta^w \geq 0} \left\{ \min_{Q_1, \dots, Q_n \geq 0} \left[\sum_{i=1}^n \left(\frac{h_i Q_i}{2} + \frac{K_i \lambda_i}{Q_i} \right) + \theta^w \left(\sum_{i=1}^n W_i Q_i - W \right) \right] \right\}$$

Differentiate and set equal to zero

$$\frac{\partial G}{\partial Q_i} = 0 \quad \text{for } i=1, \dots, n \quad \text{and} \quad \frac{\partial G}{\partial \theta^w} = 0$$

$$\frac{\partial G}{\partial Q_i} = \frac{h_i}{2} - \frac{K_i \lambda_i}{Q_i^*{}^2} + \theta^w W_i = 0 \quad \forall i=1, \dots, n$$

$$\frac{\partial G}{\partial \theta^w} = \sum_{i=1}^n W_i Q_i - W = 0$$

Solving for Q_i^* : $Q_i^* = \sqrt{\frac{2K_i \lambda_i}{h_i + 2\theta^w W_i}} \quad i=1, \dots, n$

$$\sum_{i=1}^n W_i Q_i = W$$

Budget constraints

$$Q_i^* = \sqrt{\frac{2K_i \lambda_i}{h_i + 2\theta^c C_i}} \quad \forall i=1, \dots, n \quad h_i = I \cdot C_i$$

$$\sum C_i \cdot Q_i^* = C$$

$$Q_i = \sqrt{\frac{2K_i \lambda_i}{h_i + 2\theta^c C_i}} = \sqrt{\frac{2K_i \lambda_i}{h_i}} \cdot \sqrt{\frac{1}{1 + 2\theta^c / I}}$$
$$= Q_i^{EOQ} \sqrt{\frac{1}{1 + 2\theta^c / I}} = Q_i^{EOQ} \cdot m$$

$$m = \sqrt{\frac{1}{1 + 2\theta^c / I}}$$

EOQ With Common reorder interval



$$Q_j^{EOQ} = \sqrt{\frac{2K_j \lambda_j}{h_j}} = \sqrt{\frac{2K_j \lambda_j}{h_j (1 - \lambda_j/P_j)}}$$

$$T_j^{EOQ} = \frac{Q_j^{EOQ}}{\lambda_j} \quad ; \quad T - \text{The common reorder interval for all products}$$

$g(T)$ - Average total cost as a function of T

Objective: Find a production schedule that produces all items on the single machine in such a way as to satisfy all demand, have no shortages and minimize average cost.

Average Annual Cost

$$\text{Average cost for product } j \rightarrow G_j(Q_j) = \frac{K_j \lambda_j}{Q_j} + \frac{h_j Q_j}{2}$$

$$\text{for all products } \sum_{j=1}^n G_j(Q_j) = \sum_{j=1}^n \left(\frac{K_j \lambda_j}{Q_j} + \frac{h_j Q_j}{2} \right)$$

$$Q_j = \lambda_j \cdot T \Rightarrow g(T) = \sum_{j=1}^n g_j(T) = \sum_{j=1}^n \left(\frac{K_j}{T} + \frac{h_j \lambda_j T}{2} \right)$$

$$g(T) = \frac{\sum_{j=1}^n K_j}{T} + \frac{(\sum_{j=1}^n h_j \lambda_j) \cdot T}{2}$$

$$T^* = \sqrt{\frac{2 \sum_{j=1}^n K_j}{\sum_{j=1}^n h_j \lambda_j}}$$

Adding Set-up times

S_j - Setup time for item j

• Total setup time in a cycle, $\sum_{j=1}^n S_j$ is independent of T

• Time available for setup is $T - T \cdot \sum_{j=1}^n \frac{\lambda_j}{P_j} = T \left(1 - \sum_{j=1}^n \frac{\lambda_j}{P_j} \right)$

→ if T is small \leadsto infeasible

→ if T is large \leadsto feasible (Provided there is some idle time)

• A particular T is feasible if and only if

$$\sum_{j=1}^n S_j \leq T \left(1 - \sum_{j=1}^n \frac{\lambda_j}{P_j} \right) \Leftrightarrow \sum_{j=1}^n \frac{S_j}{T} + \sum_{j=1}^n \left(\frac{\lambda_j}{P_j} \right) \leq 1$$

this leads to the constraint

$$T \geq \frac{\sum S_j}{1 - \sum \left(\frac{\alpha_j}{\beta}\right)} \equiv T_{\min}$$

Demand Rate (Forecasting)

- $F_{t-z,t}$ - Forecast made in period $t-z$ for period t
- $F_t = F_{t-1,t}$
- Time of the last observation $t-1$
- D_t - Observed values of demand (time series) for period t
 - At time t (now) the following information is available
 $D_t, D_{t-1}, D_{t-2}, \dots$
- Time series forecast is obtained by applying some set of weights to past data:
$$F_{t+1} = \sum_{n=0}^{\infty} \alpha_n \cdot D_{t-n}$$
 for some set of weights $\alpha_0, \alpha_1, \dots$
- $e_1, e_2, e_3, \dots, e_n$ - Forecast errors over past n periods
 - ↳ Difference between forecast and reality
 - for one step ahead forecasts: $e_t = F_t - D_t = F_{t-1,t} - D_t$
 - for multiple-step-ahead forecasts: $e_t = F_{t-z,t} - D_t$

Measures of Forecast Accuracy

- Mean Absolute Deviation (MAD): $MAD = \frac{1}{n} \sum_{t=1}^n |e_t|$
- Mean Square Error (MSE): $MSE = \frac{1}{n} \sum_{t=1}^n e_t^2$
- Mean Absolute Percentage Error (MAPE): $MAPE = \frac{100}{n} \sum_{t=1}^n \left| \frac{e_t}{D_t} \right|$

A good forecast should be unbiased: $E(e_t) = 0$