

# Inventory Theory

## **3 Motives for Holding Inventory**

- 1) seasonal inventory: due to seasonality (predictable)**
- 2) buffer inventory (= safety stock): due to random fluctuations (unpredictable)**
- 3) cycle inventory: due to economies of scale**

# Newsboy Model

- Buying a perishable item
- Given forecast of future sales
- Excess demand is lost
- Excess supply is salvaged

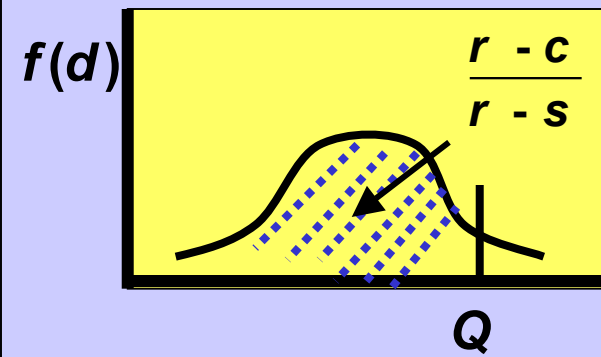
$c$  = purchase cost per unit  
 $r$  = revenue per unit  
 $s$  = salvage value per unit  
 $d$  = unknown demand

marginal cost =  $c$   
 marginal revenue =  $\begin{cases} r & \text{if } d \geq Q \\ s & \text{if } d < Q \end{cases}$

$$MC = E[MR]$$

$$c = r \Pr(d \geq Q) + s \Pr(d < Q)$$

Order  $Q$ , where  $\Pr(d \leq Q) = \frac{r - c}{r - s}$



# News vendor Problem

*... formerly called the “Newsboy Problem”.*

News guy buys  $x$  newspapers at  $c$  dollars per paper. Demand for newspapers, at price  $r > c$  is  $w$ . Unsold newspapers are redeemed at price  $s < c$ .

$w$  is a continuous random variable with distribution function  $F(W) = \text{prob}(W \leq w)$ ;  $f(w) = dF(w)/dw$ . Note that  $w \geq 0$  so  $F(w) = 0$  for  $w \leq 0$ .

$$\text{Revenue} = R = \begin{cases} rx & \text{if } x \leq w \\ rw + s(x - w) & \text{if } x > w \end{cases}$$

# News vendor Problem

$$\text{Profit} = P = \begin{cases} (r - c)x & \text{if } x \leq w \\ rw + s(x - w) - cx & \\ \quad = (r - s)w + (s - c)x & \text{if } x > w \end{cases}$$

Expected Profit =  $EP(x) =$

$$\int_{-\infty}^x [(r - s)w + (s - c)x] f(w) dw \\ + \int_x^{\infty} (r - c)x f(w) dw$$

# News vendor Problem

or  $EP(x)$

$$= (r - s) \int_{-\infty}^x w f(w) dw + (s - c)x \int_{-\infty}^x f(w) dw \\ + (r - c)x \int_x^{\infty} f(w) dw$$

$$= (r - s) \int_{-\infty}^x w f(w) dw \\ + (s - c)x F(x) + (r - c)x(1 - F(x))$$

# News vendor Problem

The first term is independent of  $x$ . The remainder of the expression can be written

$$x((s - c)F(x) + (r - c)(1 - F(x)))$$

which is 0 when  $x = 0$ . When  $x \rightarrow \infty$ , the last term goes to 0 and the remaining term,

$$x(s - c)F(x) \rightarrow -\infty.$$

# News vendor Problem

$$\begin{aligned}\frac{dEP}{dx} &= (r - s)xf(x) + (s - c)F(x) + (s - c)xf(x) \\ &\quad + (r - c)(1 - F(x)) - (r - c)xf(x) \\ &= xf(x)(r - s + s - c - r + c) \\ &\quad + r - c + (s - c - r + c)F(x) \\ &= r - c + (s - r)F(x)\end{aligned}$$

# News vendor Problem

Note that  $dEP/dx > 0$  when  $x = 0$ . Therefore  $EP$  has a maximum which is greater than 0.

The  $x = x^*$  that maximizes  $EP$  satisfies

$$\frac{dEP}{dx}(x^*) = 0.$$

$$\text{Therefore } F(x^*) = \frac{r - c}{r - s}.$$



# Newsvendor Problem

This can also be written

$$F(x^*) = \frac{r - c}{(r - c) + (c - s)}$$

$r - c > 0$  is the marginal profit when  $x < w$ .

$c - s > 0$  is the marginal loss when  $x > w$ .

*Choose  $x^*$  so that the fraction of time you do not buy too much is*

$$\frac{\text{marginal profit}}{\text{marginal profit} + \text{marginal loss}}$$

# DDI Example

$d = \text{Demand} \sim \text{Normal}$

$\mu = 150,000$

$\sigma = 45,000$

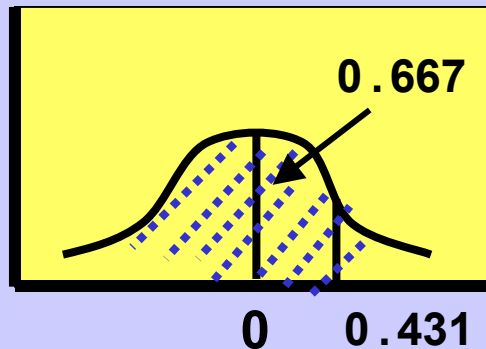
$r = \$150$

$c = \$50$

$s = \$0$

$$\Pr(d \leq Q) = \frac{r - c}{r - s} = .667$$

$$\begin{aligned}\Pr(d \leq Q) &= \Pr\left(\frac{d - 150,000}{45,000} \leq \frac{Q - 150,000}{45,000}\right) \\ &= \Pr\left(Z \leq \frac{Q - 150,000}{45,000}\right) = 0.667\end{aligned}$$



$$\Pr(Z \leq 0.431) = 0.667$$

$$\frac{Q - 150,000}{45,000} = 0.431$$

$$Q = 150,000 + \underbrace{0.431(45,000)}_{\text{safety stock}} = 169,395$$

# EOQ Model

tradeoff of holding cost vs. ordering cost

$\lambda$  = annual demand rate

$c$  = variable cost per unit

$k$  = inventory carrying cost per year (%)

$ck$  = holding cost per unit per year

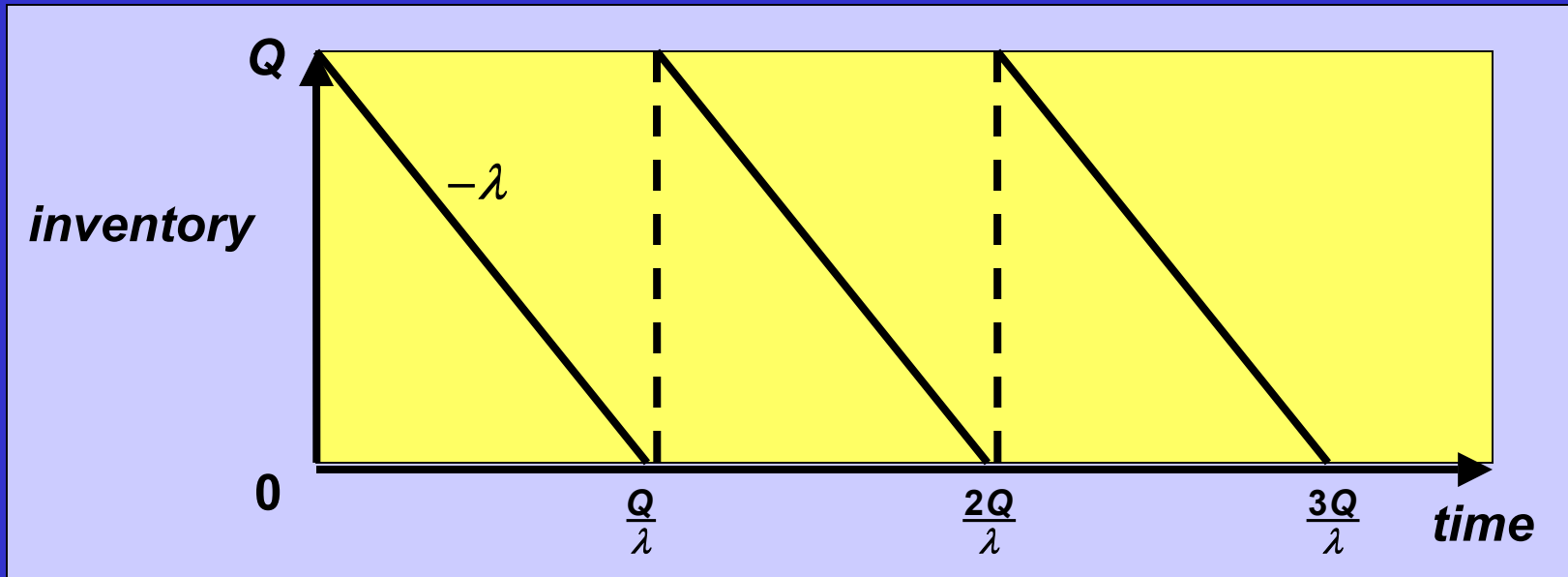
$s$  = fixed ordering cost

$Q$  = order quantity (decision)

## Assume

- 1) No statistical uncertainty
- 2) instantaneous replenishment
- 3) no shortages allowed

# EOQ Derivation



$$\text{cost / year} = s\lambda/Q + ckQ/2 + c\lambda$$

$$\frac{d(\text{cost})}{dQ} = 0 \Rightarrow Q^* = \sqrt{\frac{2\lambda s}{ck}} = \text{EOQ}$$

## Comments

1) *EOQ* is robust  $\text{Cost}(Q^*/2) = \text{cost}(2Q^*) = 1.25 \text{ cost}(Q^*)$

2)  $s \uparrow \Rightarrow Q^* \uparrow$

3)  $s \downarrow \Rightarrow Q^* \downarrow$

4)  $\lambda \uparrow \Rightarrow Q^* \uparrow$

5)  $c \uparrow \Rightarrow Q^* \downarrow$

# Dellpaq Example

$$\lambda = 300,000 \text{ per year}$$

$$s = \$100,000 + \$50 = \$100,050$$

$$c = \$3,000 + \$25 + \$1 + \$5 + \$0.50 = \$3,031.50$$

$$k = 0.20$$

$$Q^* = \sqrt{\frac{2s\lambda}{ck}} = 9950.4$$

What is re-order point?

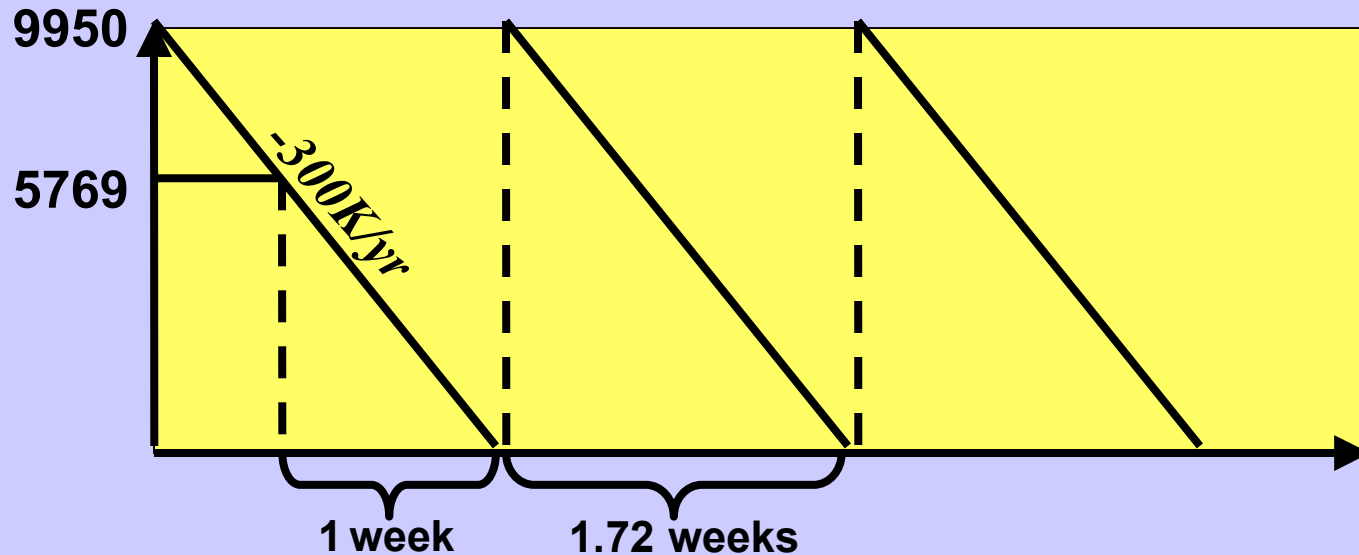
Lead time = 1 week

$$\left( \frac{9950.4 \text{ units}}{300,000 \text{ units/year}} \right) \frac{52 \text{ weeks}}{\text{year}} = 1.72 \text{ weeks}$$

# Dellpaq Example Cont.

Lead time = 1 week

$$\left( \frac{9950.4 \text{ units}}{300,000 \text{ units/year}} \right) \frac{52 \text{ weeks}}{\text{year}} = 1.72 \text{ weeks}$$



Reorder Point = inventory level at time of ordering

= demand during lead time

$$= \left( \frac{300,000 \text{ units/year}}{52 \text{ weeks/year}} \right) 1 \text{ week} = 5769 \text{ units}$$

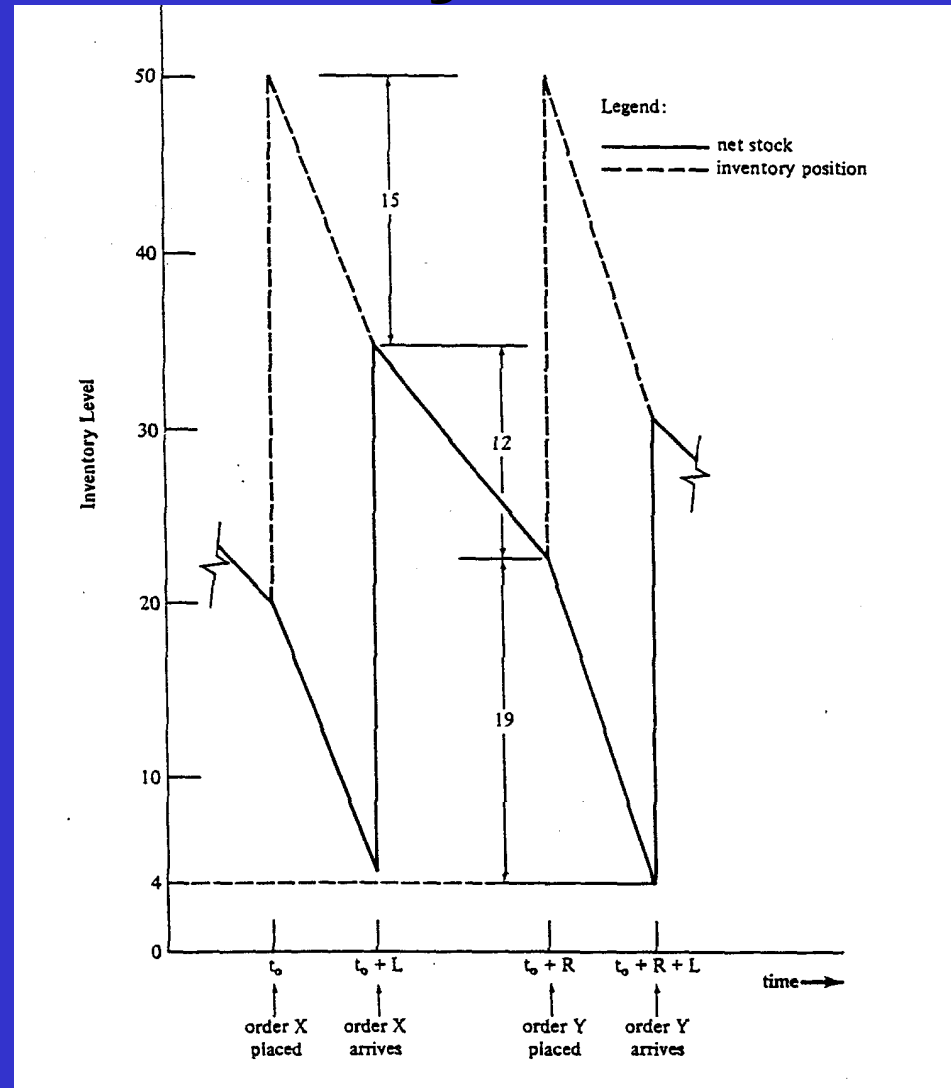
Reorder Point Policy = when inventory level drops to 5769 units,  
order 9950 units

# Inventory Position

**Q: What if lead time = 3 weeks?**

- Then you make an order before the previous order has arrived
- $\text{Inventory position} = \text{inventory on hand} + \text{inventory on order}$
- You track the inventory position, and use a reorder point policy with respect to the inventory position

# Inventory Position



**Key insight:** the current order must satisfy demand until the next order arrives



# ***(R,Q)* Policy**

**Q: What if demand is uncertain?**

***(R,Q)* policy: when inventory position drops to R, order Q**

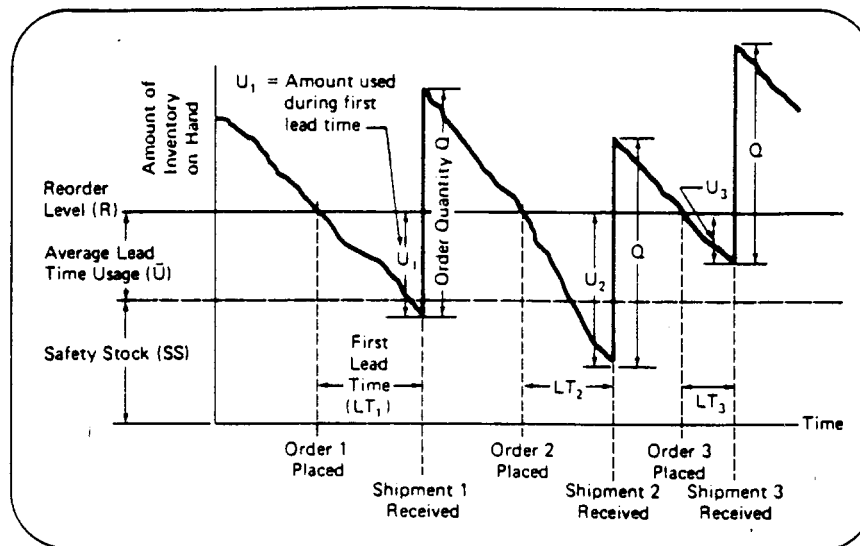
**Simple Heuristic: Set  $Q = EOQ$**

**Let  $= DDLT =$  demand during the lead time**

**We need R units to satisfy  $DDLT$**

**Use newsboy model**

**Set R so that  $\Pr(DDLT \leq R) = \frac{r - c}{r - s}$**



**Figure 10-1** Level of inventory through time in a perpetual (continuous review) system, with replenishment order quantity  $Q$  and reorder level  $R$ .

# Example

$L$  = deterministic lead time

$D_i$  = iid demand in each period

with mean  $E[D]$  and variance  $\sigma^2[D]$

$$DDL T = D_1 + \dots + D_L$$

$$E[DDL T] = LE[D]$$

$$\text{Var}[DDL T] = L\sigma^2[D]$$

set  $R$  so that  $\Pr(DDL T \leq R)$

$$= \Pr\left(\frac{DDL T - LE[D]}{\sqrt{L}\sigma[D]} \leq \frac{R - LE[D]}{\sqrt{L}\sigma[D]}\right)$$

$$= \frac{r - c}{r - s}$$