



EOQ and Beyond

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Best Buy Example

✦ Bust Buy

- ✦ Annual Demand 2,500 computers
- ✦ A computer costs \$500
- ✦ Holding cost, assume 15% annual interest
- ✦ Transportation setup cost \$3,000 per trip

✦ How much is the total cost if BB orders

- ◇ Once a year?
- ◇ Twice a year?
- ◇ ...





Once a Year

✦ Order 2500 computers once in a year

✦ Transportation cost

✦ \$3,000

✦ Inventory cost

✦ \$187,500

✦ Total Cost

✦ \$190,500



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Twice a Year

✦ Order 1250 computers twice in a year

✦ Transportation cost

✦ \$6,000

✦ Inventory cost

✦ \$93,750

✦ Total Cost

✦ \$99,750



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Photo by Nicole Suderman



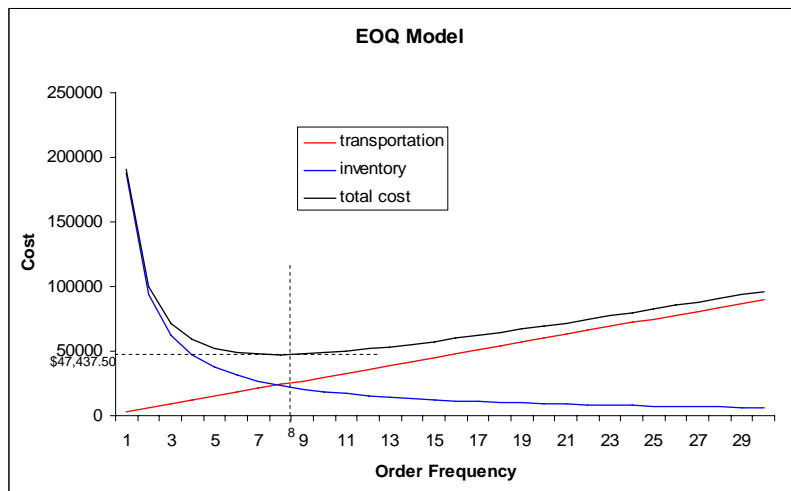
Optimal Order?

Demand= 2500 Trip cost=3000 price=500 Interest=15%

Frequency	Quantity	Transportation	Inventory	Total cost
1	2500.00	\$3,000.00	\$187,500.00	\$190,500.00
2	1250.00	\$6,000.00	\$93,750.00	\$99,750.00
3	833.33	\$9,000.00	\$62,500.00	\$71,500.00
4	625.00	\$12,000.00	\$46,875.00	\$58,875.00
5	500.00	\$15,000.00	\$37,500.00	\$52,500.00
6	416.67	\$18,000.00	\$31,250.00	\$49,250.00
7	357.14	\$21,000.00	\$26,785.71	\$47,785.71
8	312.50	\$24,000.00	\$23,437.50	\$47,437.50
9	277.78	\$27,000.00	\$20,833.33	\$47,833.33
10	250.00	\$30,000.00	\$18,750.00	\$48,750.00
11	227.27	\$33,000.00	\$17,045.45	\$50,045.45
12	208.33	\$36,000.00	\$15,625.00	\$51,625.00
13	192.31	\$39,000.00	\$14,423.08	\$53,423.08
14	178.57	\$42,000.00	\$13,392.86	\$55,392.86
15	166.67	\$45,000.00	\$12,500.00	\$57,500.00
16	156.25	\$48,000.00	\$11,718.75	\$59,718.75
17	147.06	\$51,000.00	\$11,029.41	\$62,029.41
18	138.89	\$54,000.00	\$10,416.67	\$64,416.67
19	131.58	\$57,000.00	\$9,868.42	\$66,868.42
20	125.00	\$60,000.00	\$9,375.00	\$69,375.00
21	119.05	\$63,000.00	\$8,928.57	\$71,928.57
22	113.64	\$66,000.00	\$8,522.73	\$74,522.73
23	108.70	\$69,000.00	\$8,152.17	\$77,152.17
24	104.17	\$72,000.00	\$7,812.50	\$79,812.50
25	100.00	\$75,000.00	\$7,500.00	\$82,500.00
26	96.15	\$78,000.00	\$7,211.54	\$85,211.54
27	92.59	\$81,000.00	\$6,944.44	\$87,944.44
28	89.29	\$84,000.00	\$6,696.43	\$90,696.43
29	86.21	\$87,000.00	\$6,465.52	\$93,465.52
30	83.33	\$90,000.00	\$6,250.00	\$96,250.00



Optimal Order?



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Formulation

⊕ Variables

- ⊕ **A** – Fixed cost per trip
- ⊕ **D** – Annual Demand
- ⊕ **C** – Cost per item
- ⊕ **h** – Holding cost $h=i*C$, interest rate i
- ⊕ **Q** – order quantity

⊕ Total Cost

$$Y(Q) = \frac{AD}{Q} + hQ$$

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Best Answer

⊕ Best answer fund at

$$dY(Q)/dQ = 0$$

$$-AD/Q^2 + h = 0$$

$$Q^* = \sqrt{AD/h}$$

⊕ Best Buy Example

$$\oplus Q^* = \text{sqrt}(3000*2500/(0.15*500))$$

$$\oplus Q^* \cong 316$$

$$\oplus \text{Frequency} \cong 8$$

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EOQ Takeways

- ⊞ **Order quantity causes inventory**
 - ⊞ i.e. large size translates into more stock

- ⊞ **Under certain assumptions, the quantity that optimally balances inventory cost and transportation cost is given by:**

$$Q^* = \sqrt{AD/h}$$

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What's Wrong with EOQ?

- ⊞ **Constant inventory**
 - ⊞ Computers are sold over time
 - ⊞ Inventory depletes
 - ⊞ Until refill by next order
- ⊞ **Deterministic demand**
 - ⊞ Demand actually uncertain
 - ⊞ Order more
 - ◇ stock cost goes up
 - ◇ risk of obsolescence
 - ⊞ Order less
 - ◇ Loose business opportunity

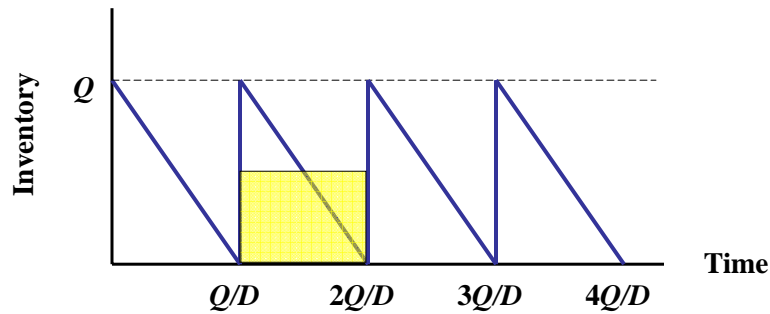


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Constant Inventory?



Average Inventory = $Q/2$

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Re-Formulation

⊕ **Total Cost**

$$Y(Q) = \frac{AD}{Q} + hQ/2$$

⊕ **Best Answer**

$$dY(Q)/dQ = 0$$

$$-AD/Q^2 + h/2 = 0$$

$$Q^* = \sqrt{2AD/h}$$

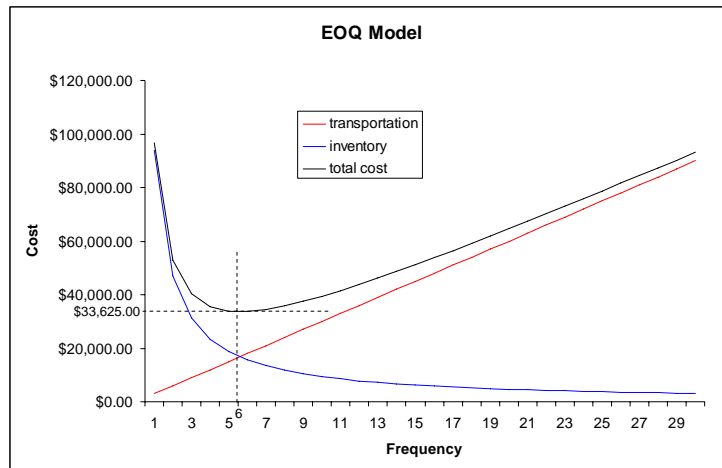
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Re-Formulation



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Deterministic Demand?

⊕ Newsvendor Problem

- ⊕ Newspapers – rapid obsolescence
- ⊕ Christmas trees – seasonal items

⊕ Nature of the Problem

- ⊕ Demand unknown in advance – distribution
- ⊕ Order once per cycle
- ⊕ If not sold, depreciate or no value
- ⊕ If shortage, loose business
- ⊕ Order quantity difficult to determine

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Formulation

X = demand (in units), a random variable.

$G(x) = P(X \leq x)$, cumulative distribution function of demand
(assumed continuous.)

$g(x) = \frac{d}{dx}G(x)$ = density function of demand.

c_o = cost (in dollars) per unit left over after demand is realized.

c_s = cost (in dollars) per unit of shortage.

Q = production/order quantity (in units); this is the decision variable.

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Formulation

⊕ Cost Function:

$Y(x)$ = expected overage + expected shortage cost

$$= c_o E[\text{units over}] + c_s E[\text{units short}]$$

$$= c_o \int_0^{\infty} \max\{Q - x, 0\} g(x) dx + c_s \int_0^{\infty} \max\{x - Q, 0\} g(x) dx$$

$$= c_o \int_0^Q (Q - x) g(x) dx + c_s \int_Q^{\infty} (x - Q) g(x) dx$$

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Formulation

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$Y(x)$ = expected overage + expected shortage cost

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$$= c_o \int_0^\infty \max\{Q-x, 0\} g(x) dx + c_s \int_0^\infty \max\{x-Q, 0\} g(x) dx$$

$$= c_o \int_0^Q (Q-x) g(x) dx + c_s \int_Q^\infty (x-Q) g(x) dx$$

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Optimal Solution

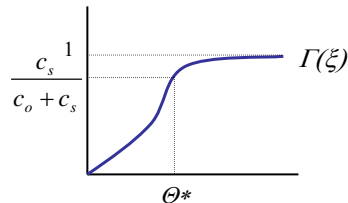
⊕ **Optimal Solution:** taking derivative of $Y(Q)$ with respect to Q , setting equal to zero, and solving yields:

$$G(Q^*) = P\{X \leq Q^*\} = \frac{c_s}{c_o + c_s} \quad \text{Critical Ratio is probability stock covers demand}$$

⊕ Notes:

$$Q^* \downarrow c_o$$

$$Q^* \uparrow c_s$$



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Example: Xmas Gift

Scenario:

- ✦ Demand for Xmas gift is exponential with mean 1000 (i.e., $G(x) = P(X \leq x) = 1 - e^{-x/1000}$).
- ✦ Cost of gift is \$10.
- ✦ Selling price is \$15.
- ✦ Unsold gift can be sold off at \$8.

Model Parameters:

$$c_s = 15 - 10 = \$5$$

$$c_o = 10 - 8 = \$2$$

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Solution

Solution:

$$G(Q^*) = 1 - e^{-\frac{Q}{1000}} = \frac{c_s}{c_o + c_s} = \frac{5}{2 + 5} = 0.714$$

$$Q^* = 1,253$$

- ✦ **Sensitivity:** If $c_o = \$10$ (i.e., shirts must be discarded) then

$$G(Q^*) = 1 - e^{-\frac{Q}{1000}} = \frac{c_s}{c_o + c_s} = \frac{5}{10 + 5} = 0.333$$

$$Q^* = 405$$

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Newsvendor Takeways

- ✦ Inventory is a hedge against demand uncertainty.
- ✦ Amount of protection depends on “overage” and “shortage” costs, as well as distribution of demand.
- ✦ If shortage cost exceeds overage cost, optimal order quantity generally increases.

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Questions?

More Information:

<http://www.factoryphysics.com/>

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