

Predictive Modeling and Analysis

Business Analytics, 1st edition
James R. Evans

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-1

- ▶ Logic-Driven Modeling
- ▶ Data-Driven Modeling
- ▶ Analyzing Uncertainty and Model Assumptions
- ▶ Model Analysis Using *Risk Solver Platform*

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-2

Logic-Driven Modeling

- ▶ Predictive modeling is the heart and soul of business decisions.
- ▶ Building decision models is more of an art than a science.
- ▶ Creating good decision models requires:
 - solid understanding of business functional areas
 - knowledge of business practice and research
 - logical skills
- ▶ It is best to start simple and enrich models as necessary.

Logic-Driven Modeling

Example 8.1 The Economic Value of a Customer

- ▶ A restaurant customer dines 6 times a year and spends an average of \$50 per visit.
- ▶ The restaurant realizes a 40% margin on the average bill for food and drinks.
- ▶ Annual gross profit on a customer = $\$50(6)(0.40)$
= \$120
- ▶ 30% of customers do not return each year.
- ▶ Average lifetime of a customer = $1/.3 = 3.33$ years
- ▶ Average gross profit for a customer = $\$120(3.33)$
= \$400

Logic-Driven Modeling

Example 8.1 (continued)

The Economic Value of a Customer

$$V = \frac{R \times F \times M}{D}$$

- V = value of a loyal customer
- R = revenue per purchase
- F = purchase frequency (number visits per year)
- M = gross profit margin
- D = defection rate (proportion customers not returning each year)

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-5

Logic-Driven Modeling

Example 8.2 A Profit Model

- Develop a decision model for predicting profit in face of uncertain demand.

P = profit
 R = revenue
 C = cost

p = unit price
 c = unit cost
 F = fixed cost
 S = quantity sold
 D = demand
 Q = quantity produced

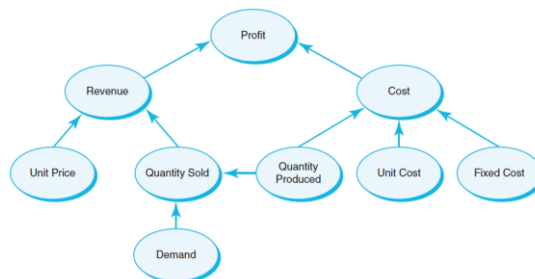


Figure 8.1

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-6

Logic-Driven Modeling

Example 8.2 (continued) A Profit Model

- Cost = fixed cost + variable cost

$$C = F + cQ$$

- Revenue = price times quantity sold

$$R = pS$$

- Quantity sold = Minimum{demand, quantity sold}

$$S = \min\{D, Q\}$$

- Profit = Revenue – Cost

$$P = p * \min\{D, Q\} - (F + cQ)$$

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-7

Logic-Driven Modeling

Example 8.2 (continued) A Profit Model

- $p = \$40$
- $c = \$24$
- $F = \$400,000$
- $D = 50,000$
- $Q = 40,000$

Compute:

- $R = p * \min\{D, Q\}$
 $= 40(40,000) = 1,600,000$
- $C = F + cQ = 1,360,000$
 $= 400,000 + 24(40,000)$
- $P = R - C = 1,600,000 - 1,360,000 = \$240,000$

	A	B	C
1	Profit Model		
2			
3	Data		
4			
5	Unit Price	\$40.00	
6	Unit Cost	\$24.00	
7	Fixed Cost	\$400,000.00	
8	Demand	50000	
9			
10			
11	Model		
12			
13	Unit Price	\$40.00	
14	Quantity Sold	40000	
15	Revenue		\$1,600,000.00
16			
17	Unit Cost	\$24.00	
18	Quantity Produced	40000	
19	Variable Cost		\$960,000.00
20	Fixed Cost		\$400,000.00
21			
22	Profit		\$240,000.00

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-8

Logic-Driven Modeling

Example 8.2 (continued) A Profit Model

	A	B	C
1	Profit Model		
2			
3	Data		
4			
5	Unit Price	\$40.00	
6	Unit Cost	\$24.00	
7	Fixed Cost	\$400,000.00	
8	Demand	50000	
9			
10			
11	Model		
12			
13	Unit Price	\$40.00	
14	Quantity Sold	40000	
15	Revenue		\$1,600,000.00
16			
17	Unit Cost	\$24.00	
18	Quantity Produced	40000	
19	Variable Cost		\$960,000.00
20	Fixed Cost		\$400,000.00
21			
22	Profit		\$240,000.00

Figure 8.2a

	A	B	C
1	Profit Model		
2			
3	Data		
4			
5	Unit Price 40		
6	Unit Cost 24		
7	Fixed Cost 400000		
8	Demand 50000		
9			
10			
11	Model		
12			
13	Unit Price =B5		
14	Quantity Sold =MIN(B8,B18)		
15	Revenue		=B13*B14
16			
17	Unit Cost =B6		
18	Quantity Produced 40000		
19	Variable Cost		=B17*B18
20	Fixed Cost		=B7
21			
22	Profit		=C15-C19-C20

Figure 8.2b

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-9

Logic-Driven Modeling

Example 8.3 New-Product Development

- ▶ Moore Pharmaceuticals needs to decide whether to conduct clinical trials and seek FDA approval for a newly developed drug.

Estimated figures:

- ▶ R&D cost = \$700 million
- ▶ Clinical trials cost = \$150 million
- ▶ Market size = 2 million people
- ▶ Market size growth = 3% per year

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-10

Logic-Driven Modeling

Example 8.3 (continued) New-Product Development

Additional estimated figures

- ▶ Market share = 8%
- ▶ Market share growth = 20% per year (for 5 years)
- ▶ Revenue from a monthly prescription = \$130
- ▶ Variable cost for a monthly prescription = \$40
- ▶ Discount rate for net present value = 9%

Moore Pharmaceuticals wants to determine net present value for the next 5 years and to determine how long it will take to recover fixed costs.

Logic-Driven Modeling

Example 8.3 (continued) New-Product Development

	A	B	C	D	E	F
1	Moore Pharmaceuticals					
2						
3	Data					
4						
5	Market size	2000000				
6	Unit (monthly Rx) revenue	130				
7	Unit (monthly Rx) cost	40				
8	Discount rate	0.09				
9						
10	Project Costs					
11	R&D	700000000				
12	Clinical Trials	150000000				
13	Total Project Costs	=B11+B12				
14						
15	Model					
16						
17	Year 1	2	3	4	5	
18	Market growth factor	0.03	0.03	0.03	0.03	
19	Market size	=B19*(1+C18)	=C19*(1+D18)	=D19*(1+E18)	=E19*(1+F18)	
20	Market share growth rate	0.2	0.2	0.2	0.2	
21	Market share	=B21*(1+C20)	=C21*(1+D20)	=D21*(1+E20)	=E21*(1+F20)	
22	Sales	=B19*B21	=C19*C21	=D19*D21	=E19*E21	=F19*F21
23						
24	Annual Revenue	=B22*\$B\$6*12	=C22*\$B\$6*12	=D22*\$B\$6*12	=E22*\$B\$6*12	=F22*\$B\$6*12
25	Annual Costs	=B22*\$B\$7*12	=C22*\$B\$7*12	=D22*\$B\$7*12	=E22*\$B\$7*12	=F22*\$B\$7*12
26	Profit	=B24-B25	=C24-C25	=D24-D25	=E24-E25	=F24-F25
27						
28	Cumulative Net Profit	=B26-B13	=B28+C26	=C28+D26	=D28+E26	=E28+F26
29						
30	Net Present Value	=NPV(B8,B26:F26),B13				

Figure 8.3b

Logic-Driven Modeling

Example 8.3 (continued) New-Product Development

	A	B	C	D	E	F
1	Moore Pharmaceuticals					
2	Data					
3						
4						
5	Market size	2,000,000				
6	Unit (monthly Rx) revenue \$	130.00				
7	Unit (monthly Rx) cost \$	40.00				
8	Discount rate	9%				
9	Project Costs					
10	R&D	\$ 700,000,000				
11	Clinical Trials	\$ 150,000,000				
12	Total Project Costs	\$ 850,000,000				
13	Model					
14						
15	Year	1	2	3	4	5
16						
17	Market growth factor		3.00%	3.00%	3.00%	3.00%
18	Market size	2,000,000	2,060,000	2,121,800	2,185,454	2,251,018
19	Market share growth rate		20.00%	20.00%	20.00%	20.00%
20	Market share	8.00%	9.60%	11.52%	13.82%	16.59%
21	Sales	160,000	197,760	244,431	302,117	373,417
22						
23	Annual Revenue	\$ 249,600,000	\$ 308,505,600	\$ 381,312,922	\$ 471,302,771	\$ 582,530,225
24	Annual Costs	\$ 76,800,000	\$ 94,924,800	\$ 117,327,053	\$ 145,016,237	\$ 179,240,069
25	Profit	\$ 172,800,000	\$ 213,580,800	\$ 263,985,869	\$ 326,286,534	\$ 403,290,156
26						
27	Cumulative Net Profit	\$ (677,200,000)	\$ (463,619,200)	\$ (199,633,331)	\$ 126,653,203	\$ 529,943,358
28						
29	Net Present Value	\$ 185,404,860				
30						

NPV =
\$185 million

Profitable
in 4th year

Figure 8.3a

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-13

Logic-Driven Modeling

Single-Period Purchase Decisions

- ▶ One-time purchase decisions often must be made in the face of uncertain demand.

Newsvendor Problem:

How many newspapers to purchase each day?

- ▶ C = cost to purchase a newspaper
- ▶ Q = number of newspapers the vendor purchases
- ▶ D = number of newspapers demanded
- ▶ R = revenue from selling a newspaper
- ▶ S = salvage value of unsold newspapers
- ▶ Net profit = $R(\min\{Q, D\}) + S(\max\{0, Q - D\}) - CQ$

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-14

Logic-Driven Modeling

Example 8.4

A Single-Period Purchase Decision Model

- Net profit = $18(\min\{Q, D\}) + 9(\max\{0, Q - D\}) - 12Q$

	A	B
1	Newsvendor Model	
2		
3	Data	
4		
5	Selling price	\$ 18.00
6	Cost	\$ 12.00
7	Discount price	\$ 9.00
8		
9	Model	
10		
11	Demand	41
12	Purchase Quantity	44
13		
14	Quantity Sold	=MIN(B11,B12) 41
15	Surplus Quantity	=MAX(0,B12-B11) 3
16		
17	Profit	=B14*B5+B15*B7-B12*B6 \$ 237.00

Figure 8.4

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-15

Logic-Driven Modeling

Example 8.5 A Hotel Overbooking Model

- ▶ A popular resort hotel has 300 rooms.
- ▶ The room rate is \$120 per night.
- ▶ Reservations can be cancelled by 6:00 p.m.
- ▶ Cost of overbooking is \$100 per occurrence.

Determine net revenue on the rooms.

- ▶ $Q = 300, P = 120, C = 100$
- ▶ $D = \text{Reservations} - \text{Cancellations}$
- ▶ Net revenue = $P(\min\{300, D\}) - C(\max\{0, D - 300\})$
 $= 120(\min\{300, D\}) - 100(\max\{0, D - 300\})$

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-16

Logic-Driven Modeling

Example 8.5 (continued)

A Hotel Overbooking Model

$$\text{Net revenue} = 120(\min\{300, D\}) - 100(\max\{0, D - 300\})$$

	A	B
1	Hotel Overbooking Model	
2		
3	Data	
4		
5	Rooms available	300
6	Price	\$120
7	Overbooking cost	\$100
8		
9	Model	
10		
11	Reservation limit	300
12	Customer demand	290
13	Reservations made	290
14	Cancellations	15
15	Customer arrivals	275
16	Overbooked customers	0
17		
18	Net revenue	\$33,000

	A	B
1	Hotel Overbooking Model	
2		
3	Data	
4		
5	Rooms available	300
6	Price	120
7	Overbooking cost	100
8		
9	Model	
10		
11	Reservation limit	300
12	Customer demand	290
13	Reservations made	=MIN(B11,B12)
14	Cancellations	15
15	Customer arrivals	=B13-B14
16	Overbooked customers	=MAX(0,B15-B5)
17		
18	Net revenue	=MIN(B15,B5)*B6-B16*B7

Figure 8.5

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-17

Logic-Driven Modeling

Example 8.6 A Retirement-Planning Model

- ▶ Start work at age 22, earning \$50,000 per year.
- ▶ Expect a salary increase of 3% per year.
- ▶ Required to contribute 8% to retirement.
- ▶ Employer contributes 35% of that amount.
- ▶ Expect an annual return of 8% on the portfolio.

Determine the value of the retirement account when the employee is 50 years old.

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-18

Logic-Driven Modeling

Example 8.6 (continued) Retirement-Planning Model

- ▶ Salary = 1.03(previous year's salary)
- ▶ Employee contribution = 0.08(salary)
- ▶ Employer contribution = 0.35(employee contrib.)
- ▶ Value of account = 1.08(previous value) + employee contribution + employer contribution

	A	B	C	D	E	
1	Retirement Plan Model					
2	Data					
3	Retirement contribution (% of salary) 0.08					
4	Employer match 0.35					
5	Annual salary increase 0.03					
6	Annual return on investment 0.08					
7	Model					
8		Age	Salary	Employee Contribution	Employer Contribution	Balance
9	14	22	50000	=B14*\$B\$5	=B\$5*C14	=C14+D14
10	15	23	= B14*(1+\$B\$7)	=B15*\$B\$5	=B\$5*C15	=E14*(1+\$B\$8) + C15+D15
11	16	24	= B15*(1+\$B\$7)	=B16*\$B\$5	=B\$5*C16	=E15*(1+\$B\$8) + C16+D16
12	17	25	= B16*(1+\$B\$7)	=B17*\$B\$5	=B\$5*C17	=E16*(1+\$B\$8) + C17+D17

Copyright Education, Inc. publishing as Prentice Hall

8-19

Figure 8.6a

Logic-Driven Modeling

Example 8.6 (continued) Retirement Planning Model

	A	B	C	D	E	
1	Retirement Plan Model					
2	Data					
3	Retirement contribution (% of salary) 8%					
4	Employer match 35%					
5	Annual salary increase 3%					
6	Annual return on investment 8%					
7	Model					
8		Age	Salary	Employee Contribution	Employer Contribution	Balance
9	14	22	\$50,000	\$4,000	\$1,400	\$5,400
10	15	23	\$51,500	\$4,120	\$1,442	\$11,394
11	16	24	\$53,045	\$4,244	\$1,485	\$18,034
12	17	25	\$54,636	\$4,371	\$1,530	\$25,378
13	18	26	\$56,275	\$4,502	\$1,576	\$33,486
14	19	27	\$57,964	\$4,637	\$1,623	\$42,425
15	20	28	\$59,703	\$4,776	\$1,672	\$52,267
16	21	29	\$61,494	\$4,919	\$1,722	\$63,089
17	22	30	\$63,339	\$5,067	\$1,773	\$74,977
18	23	31	\$65,239	\$5,219	\$1,827	\$88,021
19	24	32	\$67,196	\$5,376	\$1,881	\$102,320
20	25	33	\$69,212	\$5,537	\$1,938	\$117,980
21	26	34	\$71,288	\$5,703	\$1,996	\$135,118
22	27	35	\$73,427	\$5,874	\$2,056	\$153,857
23	28	36	\$75,629	\$6,050	\$2,118	\$174,334
24	29	37	\$77,898	\$6,232	\$2,181	\$196,694
25	30	38	\$80,235	\$6,419	\$2,247	\$221,094
26	31	39	\$82,642	\$6,611	\$2,314	\$247,707
27	32	40	\$85,122	\$6,810	\$2,383	\$276,717
28	33	41	\$87,675	\$7,014	\$2,455	\$308,323
29	34	42	\$90,306	\$7,224	\$2,529	\$342,742
30	35	43	\$93,015	\$7,441	\$2,604	\$380,207
31	36	44	\$95,805	\$7,664	\$2,683	\$420,971
32	37	45	\$98,679	\$7,894	\$2,763	\$465,306
33	38	46	\$101,640	\$8,131	\$2,846	\$513,507
34	39	47	\$104,689	\$8,375	\$2,931	\$565,894
35	40	48	\$107,830	\$8,626	\$3,019	\$622,811
36	41	49	\$111,064	\$8,885	\$3,110	\$684,631
37	42	50	\$114,396	\$9,152	\$3,203	\$751,757

Value at 22 years old = \$5,400

Value at 50 years old = \$751,757

Figure 8.6b

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-20

Data-Driven Modeling

Example 8.7

Modeling Retail Markdown Pricing Decisions

- ▶ In the spring, a department store introduces a new line of bathing suits that sells for \$70.
- ▶ The store purchases 1000 of these bathing suits.
- ▶ During the prime selling season, the store sells an average of 7 units per day at full price (40 days).
- ▶ On 10 sale days, the price is discounted 30% and sales increase to 32.2 units per day.
- ▶ Around July 4th, the price is marked down 70% to sell off remaining inventory.
- ▶ Determine total revenue from the bathing suits.

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-21

Data-Driven Modeling

Example 8.7 (continued)

Modeling Retail Markdown Pricing Decisions

Assume a linear trend model between sales and price:

$$\text{daily sales} = a - b(\text{price})$$

$$7 = a - b(70)$$

$$32.2 = a - b(49)$$

$$\text{Daily sales} = 91 - 1.2(\text{price})$$

	A	B	C
1	Markdown Pricing Model		
2			
3	Data		
4	Retail price	70	
5	Inventory	1000	
6	Selling season (days)	50	
7	Days at full retail	40	
8	Intermediate markdown	0.3	
9	Clearance markdown	0.7	
10	Demand function		
11	a	91	
12	b	1.2	
13			
14	Model		
15			
16	Full Retail Sales		
17	Retail price	=B4	
18	Daily sales	=B11*B12*B17	
19	Days at retail price	=B7	
20	Units sold at retail	=B18*B19	
21	Retail revenue	=B20*B17	
22	Discount Sales		
23	Discount	=B8	
24	Discount price	=B17*(1-B23)	
25	Daily sales	=B11 - B12*B24	
26	Unit sold	=MIN(B25*(B6-B19), B5-B20)	
27	Discount revenue	=B26*B24	
28	Clearance Sales		
29	Clearance price	=B4*(1-B9)	
30	Units sold at clearance	=MAX(0, B5-B20-B26)	
31	Clearance revenue	=B29*B30	
32			
33			Total revenue =C21+C27+C31

Figure 8.7

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-22

Data-Driven Modeling

Example 8.7 (continued)

Revenue from full retail sales

$$= \text{units sold} * \text{days} * \text{price}$$

$$= (7) * (40) * (70)$$

$$= \$19,600$$

Revenue from sale weekends

$$= (32.2) * (10) * (49)$$

$$= \$15,778$$

Revenue from clearance sales

$$= \text{leftovers} * \text{price}$$

$$= (1000 - 7(40) - 32.2(10)) * (21)$$

$$= (398)(21)$$

$$= \$8,358$$

	A	B	C
1	Markdown Pricing Model		
2			
3	Data		
4	Retail price	70	
5	Inventory	1000	
6	Selling season (days)	50	
7	Days at full retail	40	
8	Intermediate markdown	0.3	
9	Clearance markdown	0.7	
10	Demand function		
11		a 91	
12		b 1.2	
13			
14	Model		
15			
16	Full Retail Sales		
17	Retail price	=B4	
18	Daily sales	=B11*B12*B17	
19	Days at retail price	=B7	
20	Units sold at retail	=B18*B19	
21			Retail revenue =B20*B17
22	Discount Sales		
23	Discount	=B8	
24	Discount price	=B17*(1-B23)	
25	Daily sales	=B11 - B12*B24	
26	Unit sold	=MIN(B25*(B6-B19),B5-B20)	
27			Discount revenue =B26*B24
28	Clearance Sales		
29	Clearance price	=B4*(1-B9)	
30	Units sold at clearance	=MAX(0,B5-B20-B26)	
31			Clearance revenue =B29*B30
32			
33			Total revenue =C21+C27+C31

Figure 8.7

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-23

Data-Driven Modeling

Example 8.7 (continued)

Modeling Retail Markdown Pricing Decisions

	A	B	C
1	Markdown Pricing Model		
2			
3	Data		
4	Retail price	70	
5	Inventory	1000	
6	Selling season (days)	50	
7	Days at full retail	40	
8	Intermediate markdown	0.3	
9	Clearance markdown	0.7	
10	Demand function		
11		a 91	
12		b 1.2	
13			
14	Model		
15			
16	Full Retail Sales		
17	Retail price	=B4	
18	Daily sales	=B11*B12*B17	
19	Days at retail price	=B7	
20	Units sold at retail	=B18*B19	
21			Retail revenue =B20*B17
22	Discount Sales		
23	Discount	=B8	
24	Discount price	=B17*(1-B23)	
25	Daily sales	=B11 - B12*B24	
26	Unit sold	=MIN(B25*(B6-B19),B5-B20)	
27			Discount revenue =B26*B24
28	Clearance Sales		
29	Clearance price	=B4*(1-B9)	
30	Units sold at clearance	=MAX(0,B5-B20-B26)	
31			Clearance revenue =B29*B30
32			
33			Total revenue =C21+C27+C31

	A	B	C
1	Markdown Pricing Model		
2			
3	Data		
4	Retail price	\$70.00	
5	Inventory	1000	
6	Selling season (days)	50	
7	Days at full retail	40	
8	Intermediate markdown	30%	
9	Clearance markdown	70%	
10	Demand function		
11		a 91	
12		b 1.2	
13			
14	Model		
15			
16	Full Retail Sales		
17	Retail price	\$70.00	
18	Daily sales	7.00	
19	Days at retail price	40	
20	Units sold at retail	280	
21			Retail revenue \$19,600.00
22	Discount Sales		
23	Discount	30%	
24	Discount price	\$49.00	
25	Daily sales	32.20	
26	Unit sold	322	
27			Discount revenue \$15,778.00
28	Clearance Sales		
29	Clearance price	\$21.00	
30	Units sold at clearance	398	
31			Clearance revenue \$8,358.00
32			
33			Total revenue \$43,736.00

Total revenue = \$43,736

Figure 8.7

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-24

Data-Driven Modeling

Modeling Relationships and Trends in Data

- Create charts to better understand data sets.
- For cross-sectional data, use a scatter chart.
- For time series data, use a line chart.
- Consider using mathematical functions to model relationships.

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-25

Data-Driven Modeling

Excel Trendline tool

Click on a chart

▶ *Chart tools*

▶ *Layout*

▶ *Trendline*

Choose a Trendline.
Choose whether to
display equation and
R-squared.

R-squared values closer to 1
indicate better fit of the
Trendline to the data.

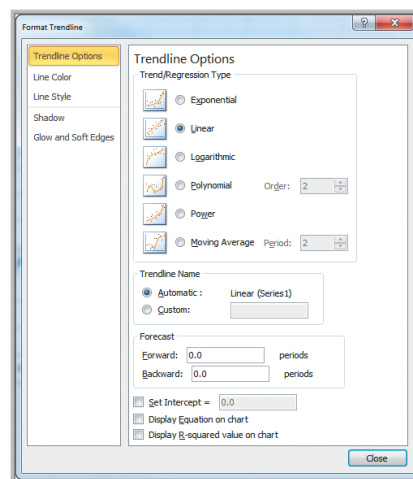


Figure 8.8

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-26

Data-Driven Modeling

Example 8.8 Modeling a Price-Demand Function

Linear demand function:

$$\text{Sales} = -9.5116(\text{price}) + 20512$$

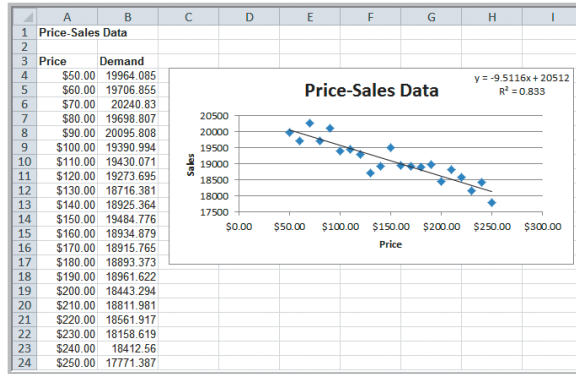


Figure 8.9

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-27

Data-Driven Modeling

Example 8.9 Predicting Crude Oil Prices

- Line chart of historical crude oil prices

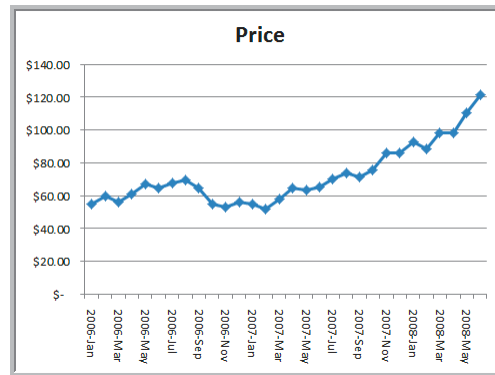


Figure 8.10

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-28

Data-Driven Modeling

Example 8.9 (continued) Predicting Crude Oil Prices

- Excel's *Trendline* tool is used to fit various functions to the data.

Logarithmic $y = 13 \ln(x) + 39$ $R^2 = 0.382$

Power $y = 45.96x^{0.0169}$ $R^2 = 0.397$

Exponential $y = 50.5e^{0.021x}$ $R^2 = 0.664$

Polynomial 2^o $y = 0.13x^2 - 2.4x + 68$ $R^2 = 0.905$

Polynomial 3^o $y = 0.005x^3 - 0.111x^2$
 $+ 0.648x + 59.5$ $R^2 = 0.928$ *

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-29

Data-Driven Modeling

Example 8.9 (continued) Predicting Crude Oil Prices

- Third Order Polynomial Trendline fit to the data

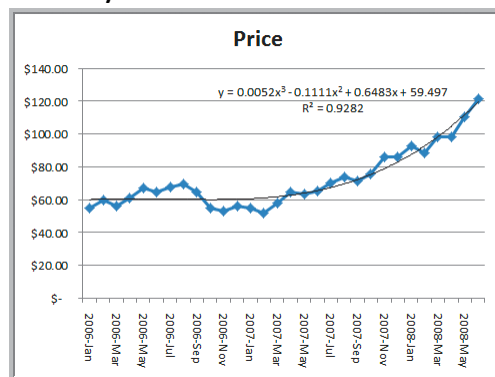


Figure 8.11

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-30

Analyzing Uncertainty and Model Assumptions

What-If Analysis

- Spreadsheet models allow you to easily evaluate what-if questions.
- How do changes in model inputs (that reflect key assumptions) affect model outputs?
- Systematic approaches to what-if analysis make the process easier and more useful.

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-31

Analyzing Uncertainty and Model Assumptions

Data Tables

- ▶ Data Tables summarize the impact of one or two inputs on a specified output.
- ▶ Excel data table types:
 - One-way data tables – for one input variable
 - Two-way data table – for two input variables

To construct a data table:

- ▶ *Data*
- ▶ *What-If Analysis*
- ▶ *Data Table*

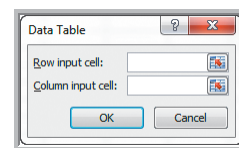


Figure 8.14

Copyright © 2013 Pearson
Education, Inc. publishing as
Prentice Hall

8-32

Analyzing Uncertainty and Model Assumptions

Example 8.11

A One-Way Data Table for Uncertain Demand

Create a column of demand values (column E).

Enter =C22 in cell F3

(to reference the output cell).

Highlight the range E3:F11.

Choose *Data Table*.

Enter B8 for *Column input cell*.

(tells Excel that column E is demand values)

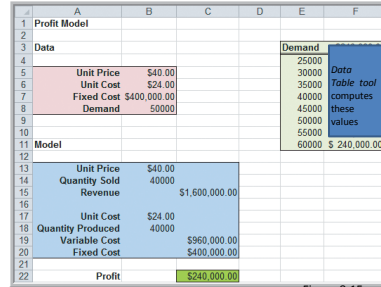


Figure 8.15a

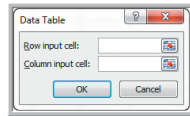


Figure 8.14
8-33

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

Analyzing Uncertainty and Model Assumptions

Example 8.11 (continued)

A One-Way Data Table for Uncertain Demand

The Data Table tool computes the profit values in column F (below \$240,000).

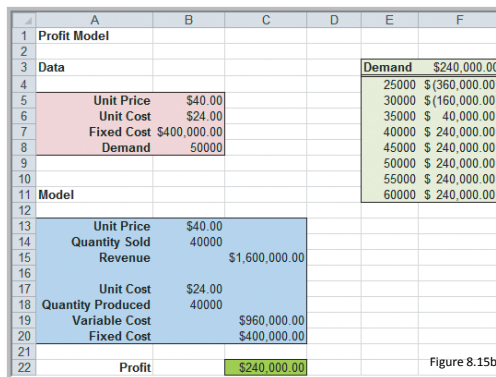


Figure 8.15b

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

Analyzing Uncertainty and Model Assumptions

Example 8.12

One-Way Data Tables with Multiple Outputs

- Create a second output, revenue.

Enter =C15 in cell G3.

Highlight E3:G11.

Choose *Data Table*

Proceed as in the previous example.

Excel computes the revenues values.

	A	B	C	D	E	F	G
1	Profit Model						
2						Profit	Revenue
3	Data				Demand	\$240,000.00	\$1,600,000.00
4					25000	\$ (360,000.00)	\$ 1,000,000.00
5	Unit Price	\$40.00			30000	\$ (160,000.00)	\$ 1,200,000.00
6	Unit Cost	\$24.00			35000	\$ 40,000.00	\$ 1,400,000.00
7	Fixed Cost	\$400,000.00			40000	\$ 240,000.00	\$ 1,600,000.00
8	Demand	50000			45000	\$ 240,000.00	\$ 1,600,000.00
9					50000	\$ 240,000.00	\$ 1,600,000.00
10					55000	\$ 240,000.00	\$ 1,600,000.00
11					60000	\$ 240,000.00	\$ 1,600,000.00
12	Model						
13	Unit Price	\$40.00					
14	Quantity Sold	40000					
15	Revenue		\$1,600,000.00				
16							
17	Unit Cost	\$24.00					
18	Quantity Produced	40000					
19	Variable Cost		\$960,000.00				
20	Fixed Cost		\$400,000.00				
21							
22	Profit		\$240,000.00				

Figure 8.15

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-35

Analyzing Uncertainty and Model Assumptions

Example 8.13

A Two-Way Data Table for the Profit Model

- Evaluate the impact of both unit price and unit cost

Create a column of unit prices (F5:F15).

Create a row of unit costs (G4:J4).

Enter =C22 in cell F4.

Choose *Data Table*.

	A	B	C	D	E	F	G	H	I	J		
1	Profit Model											
2												
3	Data					Unit Price	\$240,000.00	Unit Cost	\$22.00	\$23.00	\$24.00	\$25.00
4												
5	Unit Price	\$40.00				\$30.00						
6	Unit Cost	\$24.00				\$30.00						
7	Fixed Cost	\$400,000.00				\$37.00						
8	Demand	50000				\$38.00						
9						\$39.00						
10						\$40.00						
11						\$41.00						
12						\$42.00						
13	Unit Price	\$40.00				\$43.00						
14	Quantity Sold	40000				\$44.00						
15	Revenue		\$1,600,000.00			\$45.00						
16												
17	Unit Cost	\$24.00										
18	Quantity Produced	40000										
19	Variable Cost		\$960,000.00									
20	Fixed Cost		\$400,000.00									
21												
22	Profit		\$240,000.00									

Figure 8.17a

Enter B6 for Row input cell.

Enter B5 for Column input cell.

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-36

Analyzing Uncertainty and Model Assumptions

Example 8.13 (continued)

A Two-Way Data Table for the Profit Model

	A	B	C	D	E	F	G	H	I	J
1	Profit Model									
2										
3	Data									
4					Unit	Unit Cost				
5	Unit Price	\$40.00			Unit Price	\$240,000.00	\$22.00	\$23.00	\$24.00	\$25.00
6	Unit Cost	\$24.00				\$35.00	\$120,000.00	\$80,000.00	\$40,000.00	\$0.00
7	Fixed Cost	\$400,000.00				\$36.00	\$160,000.00	\$120,000.00	\$80,000.00	\$40,000.00
8	Demand	50000				\$37.00	\$200,000.00	\$160,000.00	\$120,000.00	\$80,000.00
9						\$38.00	\$240,000.00	\$200,000.00	\$160,000.00	\$120,000.00
10						\$39.00	\$280,000.00	\$240,000.00	\$200,000.00	\$160,000.00
11	Model					\$40.00	\$320,000.00	\$280,000.00	\$240,000.00	\$200,000.00
12						\$41.00	\$360,000.00	\$320,000.00	\$280,000.00	\$240,000.00
13	Unit Price	\$40.00				\$42.00	\$400,000.00	\$360,000.00	\$320,000.00	\$280,000.00
14	Quantity Sold	40000				\$43.00	\$440,000.00	\$400,000.00	\$360,000.00	\$320,000.00
15	Revenue		\$1,600,000.00		\$44.00	\$480,000.00	\$440,000.00	\$400,000.00	\$360,000.00	
16					\$45.00	\$520,000.00	\$480,000.00	\$440,000.00	\$400,000.00	
17	Unit Cost	\$24.00								
18	Quantity Produced	40000								
19	Variable Cost		\$960,000.00							
20	Fixed Cost		\$400,000.00							
21										
22	Profit		\$240,000.00							

Figure 8.17b

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-37

Analyzing Uncertainty and Model Assumptions

Goal Seek

Goal Seek allows you to alter the data used in a formula in order to find out what the results will be.

- ▶ **Set cell** contains the formula that will return the result you're seeking.
- ▶ **To value** is the target value you want the formula to return.
- ▶ **By changing cell** is the location of the input value that Excel can change to reach the target.

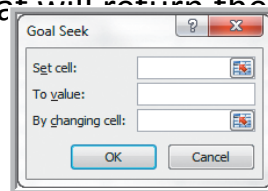


Figure 8.21

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-38

Analyzing Uncertainty and Model Assumptions

Example 8.15 Finding the Breakeven Point in the Outsourcing Model (using *Goal Seek*)

- Find the value of demand at which manufacturing cost equals purchased cost
- *Set cell:* B19
- *To value:* 0
- *By changing cell:* B12.

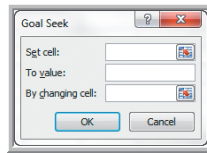


Figure 8.21

The breakeven volume is 1000 units.

	A	B
1	Outsourcing Decision Model	
2		
3	Data	
4		
5	Manufactured in-house	
6	Fixed cost	\$50,000
7	Unit variable cost	\$125
8		
9	Purchased from supplier	
10	Unit cost	\$175
11		
12	Production volume	1000
13		
14	Model	
15		
16	Total manufacturing cost	\$175,000
17	Total purchased cost	\$175,000
18		
19	Cost difference	\$0
20	Decision	Manufacture

Figure 8.22

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

Model Analysis Using *Risk Solver Platform*

Tornado Chart

- Shows the impact that variation in a model input has on some output while holding all other inputs constant.
- Shows which inputs are the least and most influential on the output.
- Helps you select the inputs that you would want to further analyze.

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

Model Analysis Using *Risk Solver Platform*

Example 8.17

Creating a Tornado Chart in *Risk Solver Platform*

Profit Model

Select cell C22.

Parameters

Identify

A 10% change in unit price (B5) affects profit the most. Next is unit cost (B6).

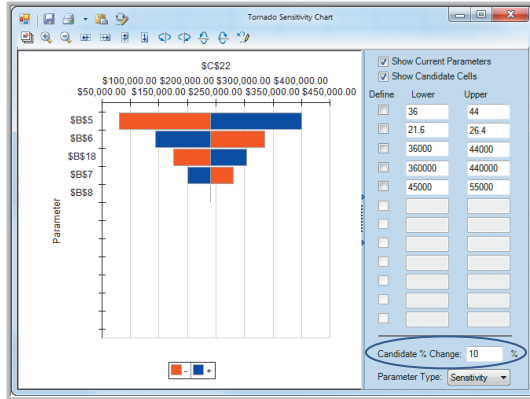


Figure 8.28

Copyright © 2013 Pearson Education, Inc. publishing as Prentice Hall

8-41