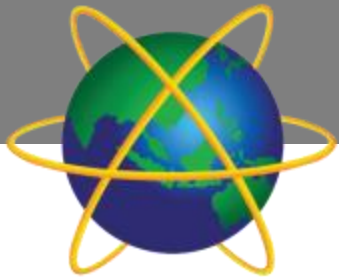


Operational Research and Optimisation

AQ052-3-M-ORO and VD1

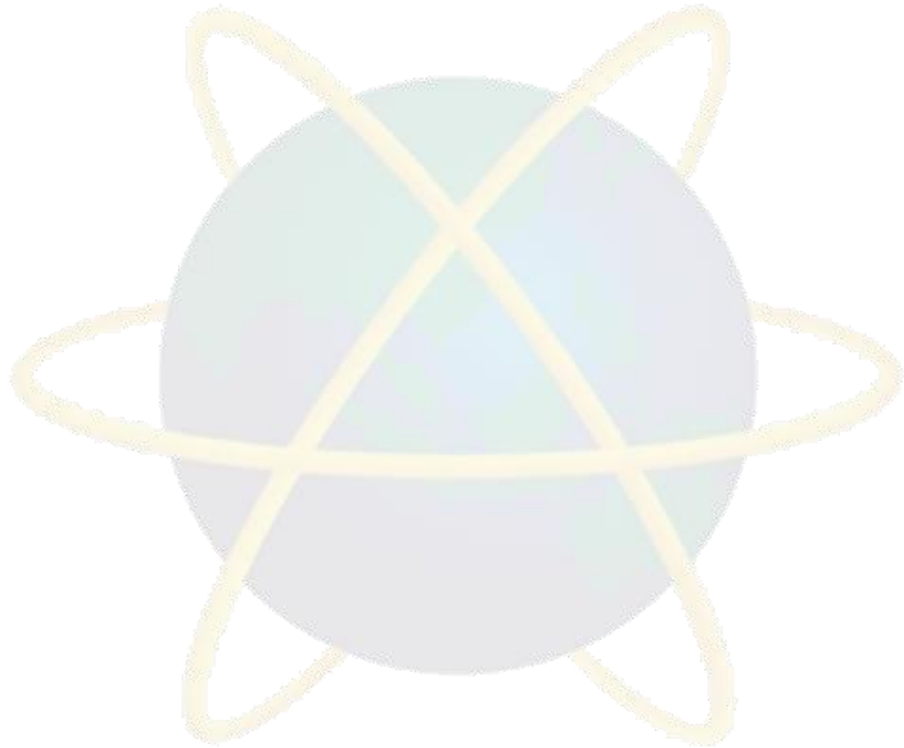


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Nonlinear Programming

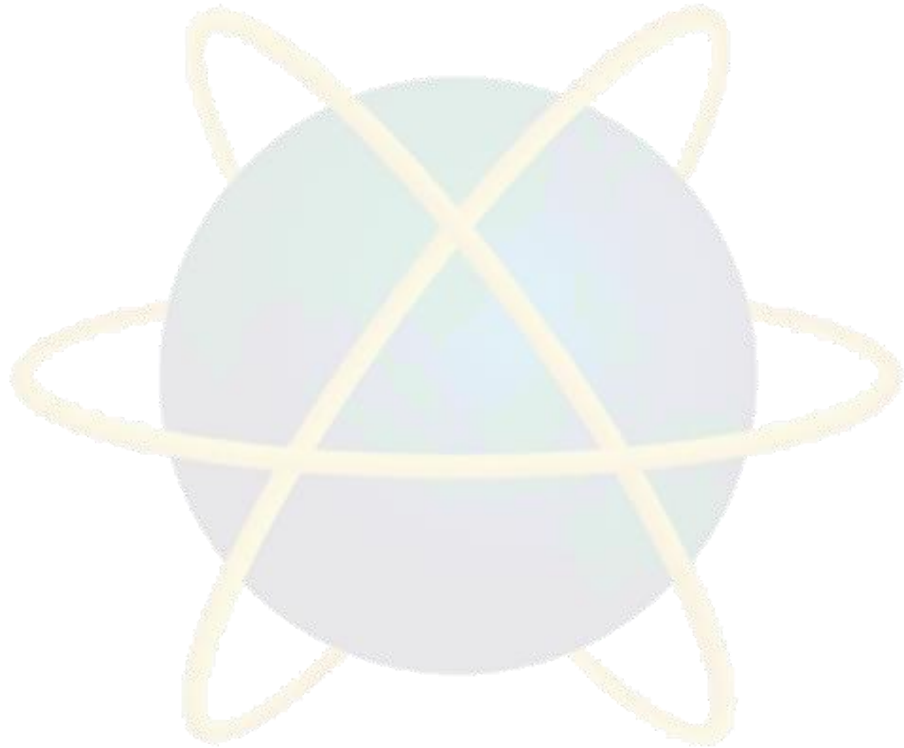
Topic & Structure of the lesson

- **Unconstrained algorithms**
- **Constrained algorithms**



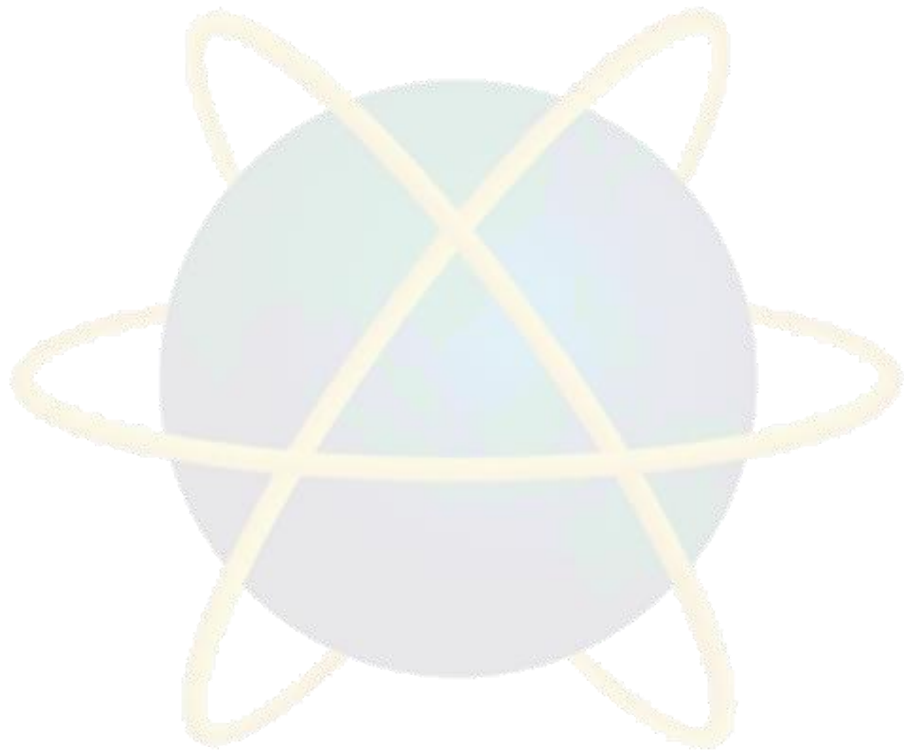
Learning Outcomes

- At the end of this topic, You should be able to apply non-linear programming model in a real world problem.



Key Terms you must be able to use

If you have mastered this topic, you should be able to use the following terms correctly in your assignments and exams:



Overview

- ✦ Many business problems can be modeled only with nonlinear functions.
- ✦ Problems that fit the general linear programming format but contain nonlinear functions are termed nonlinear programming (NLP) problems.
- ✦ Solution methods are more complex than linear programming methods.
- ✦ Often difficult, if not impossible, to determine optimal solution.
- ✦ Solution techniques generally involve searching a solution surface for high or low points requiring the use of advanced mathematics.
- ✦ Computer techniques (Excel) are used in this chapter.

Optimal Value of a Single Nonlinear Function

Basic Model

Profit function, Z , with volume independent of price:

$$Z = vp - c_f - vc_v$$

where v = sales volume

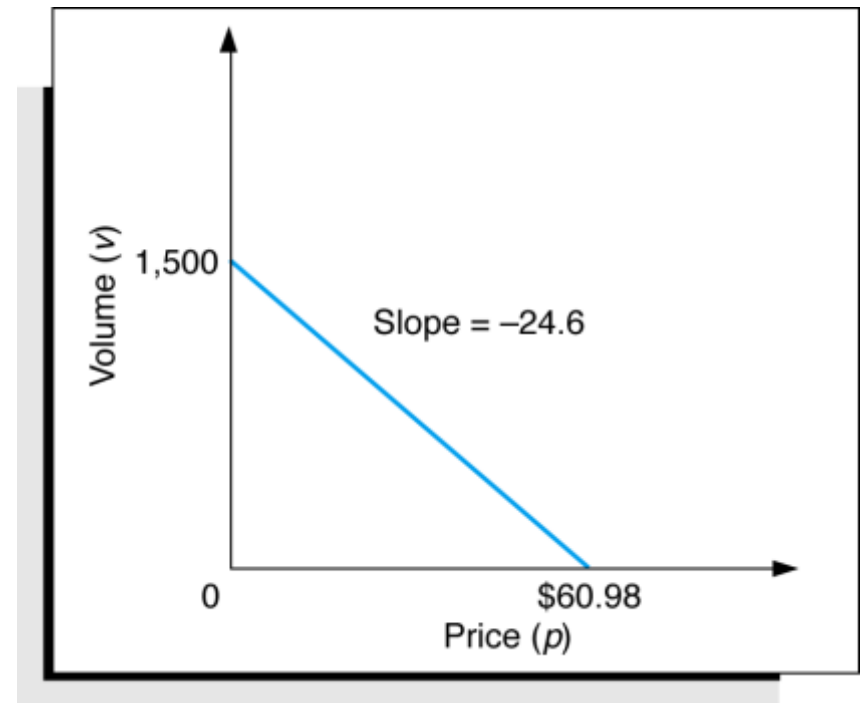
p = price

c_f = fixed cost

c_v = variable cost

Add volume/price relationship:

$$v = 1,500 - 24.6p$$

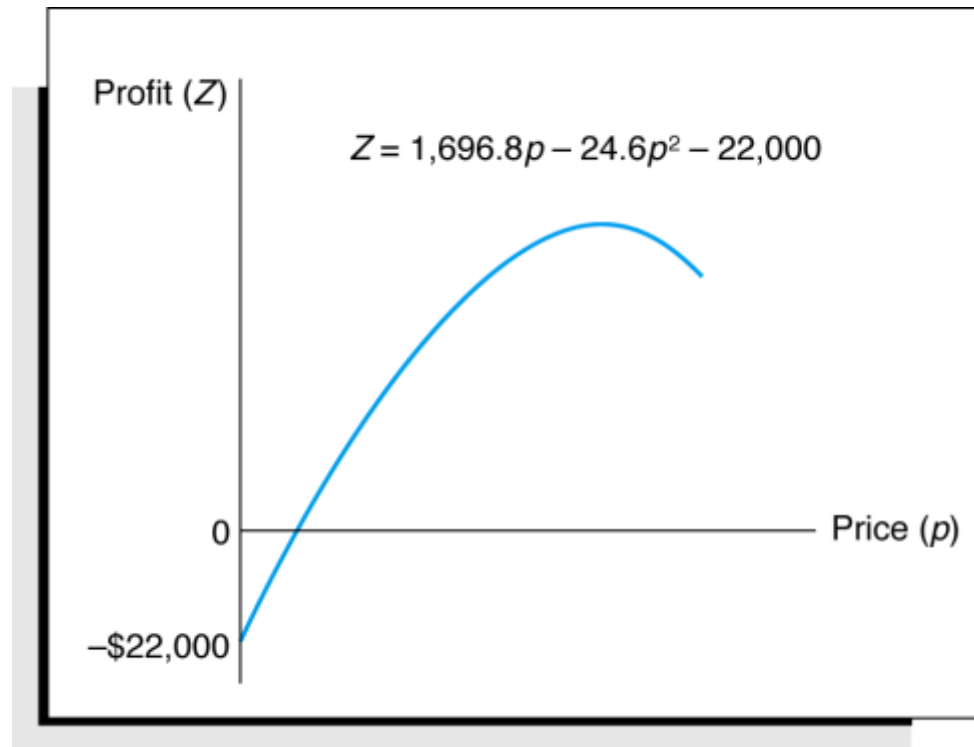


Optimal Value of a Single Nonlinear Function

Expanding the Basic Model to a Nonlinear Model

With fixed cost ($c_f = \$10,000$) and variable cost ($c_v = \8):

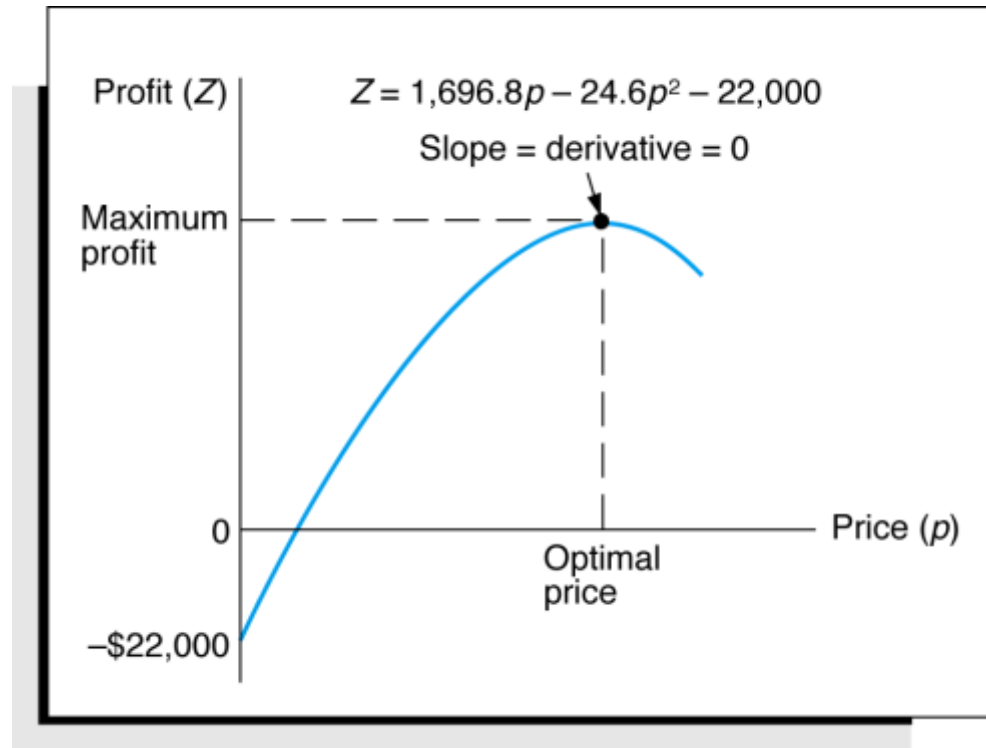
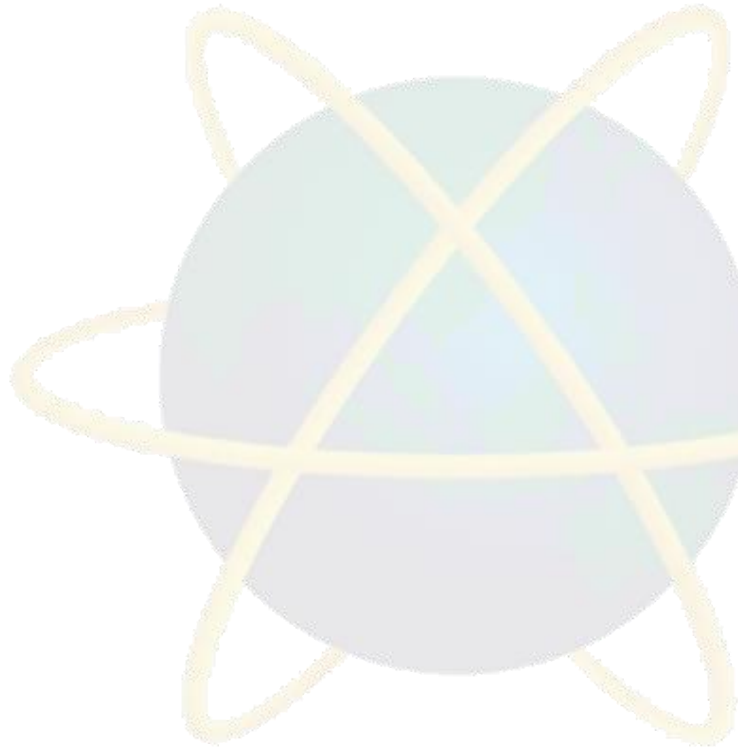
$$Z = 1,696.8p - 24.6p^2 - 22,000$$



Optimal Value of a Single Nonlinear Function

Maximum Point on a Curve

- ✧ The slope of a curve at any point is equal to the derivative of the curve's function.
- ✧ The slope of a curve at its highest point equals zero.



Optimal Value of a Single Nonlinear Function Solution Using Calculus

nonlinearity!

$$Z = 1,696.8 \cdot p - 24.6 \cdot p^2 - 22,000$$

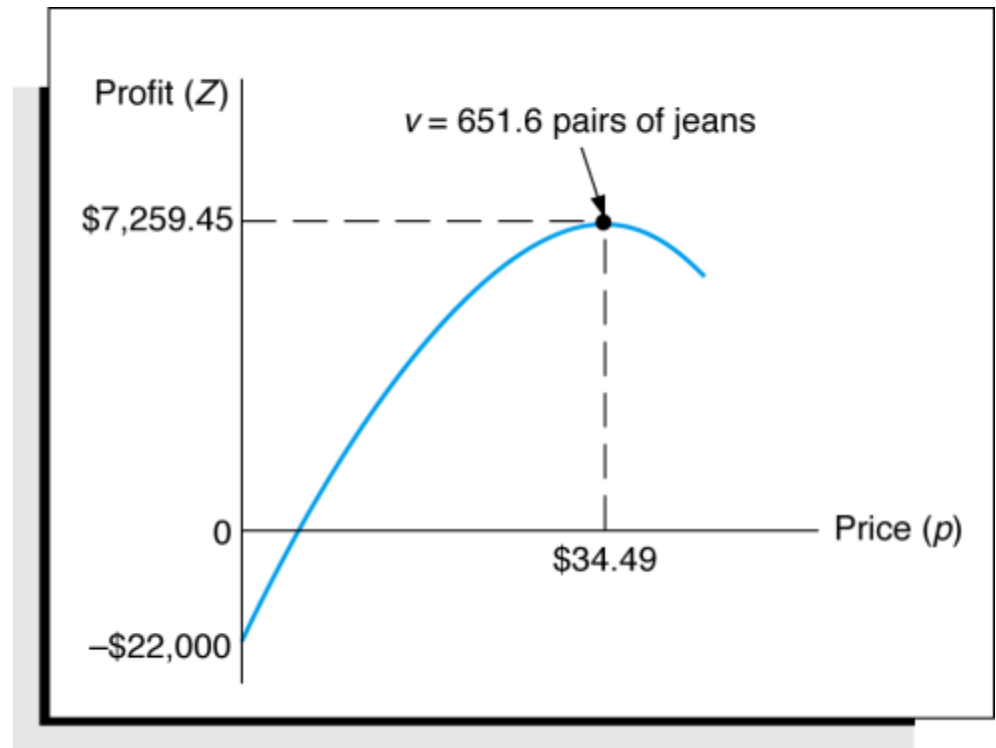
$$dZ/dp = 1,696.8 - 49.2p$$

$$p = \$34.49$$

$$v = 1,500 - 24.6p$$

$$v = 651.6 \text{ pairs of jeans}$$

$$Z = \$7,259.45$$



Constrained Optimization in Nonlinear Problems

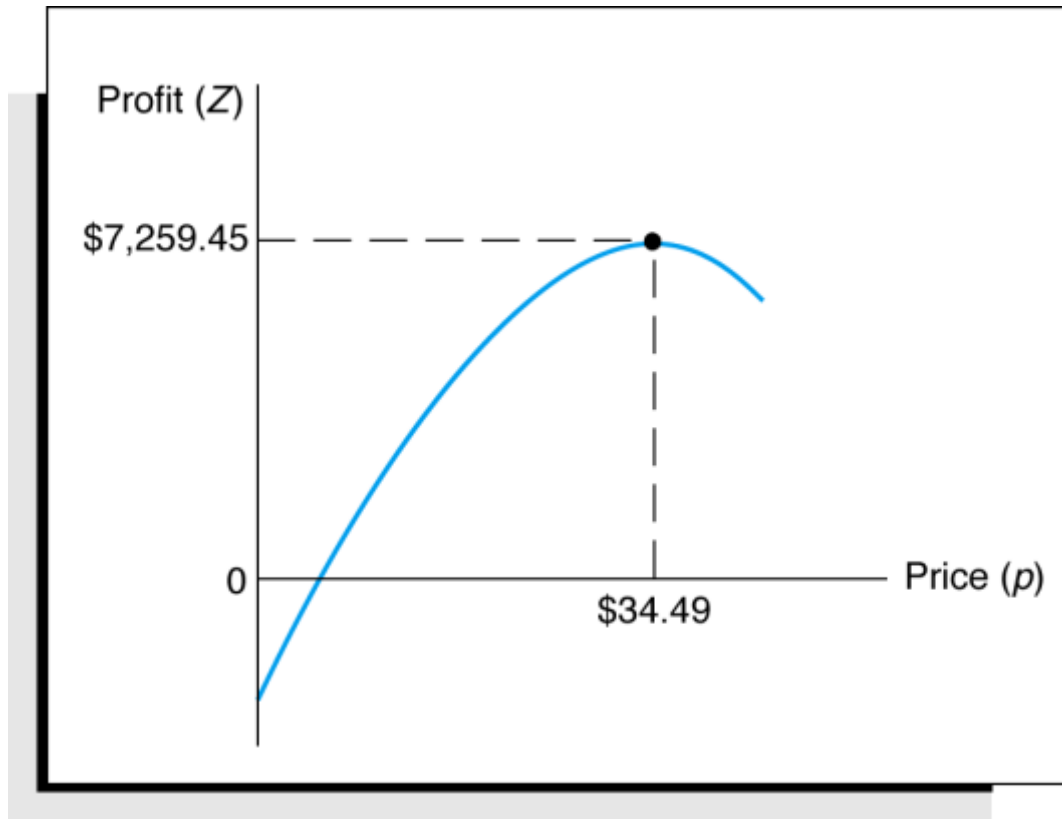
Definition

- ✦ If a nonlinear problem contains one or more constraints it becomes a constrained optimization model or a *nonlinear programming* model.
- ✦ A nonlinear programming model has the same general form as the linear programming model except that the objective function *and/or* the constraint(s) are nonlinear.
- ✦ Solution procedures are much more complex and no guaranteed procedure exists.

Constrained Optimization in Nonlinear Problems

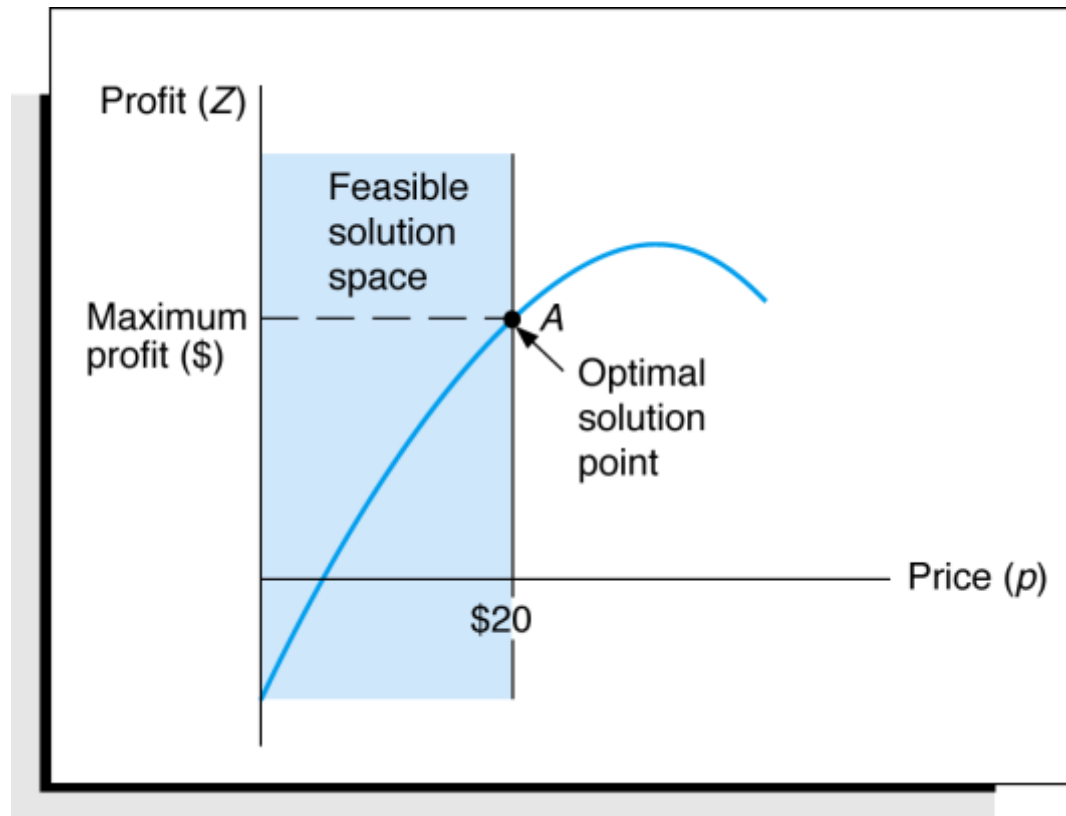
Graphical Interpretation (1 of 3)

☀ Effect of adding constraints to nonlinear problem:



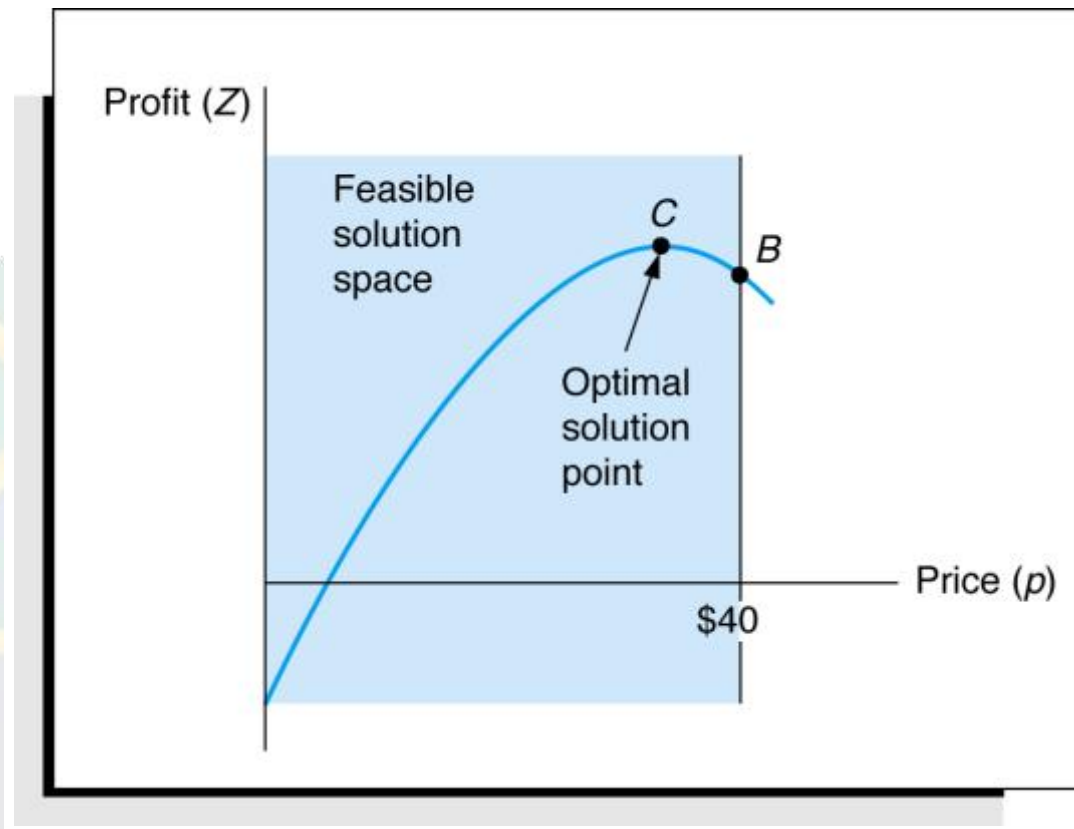
Constrained Optimization in Nonlinear Problems

Graphical Interpretation (2 of 3)



Constrained Optimization in Nonlinear Problems

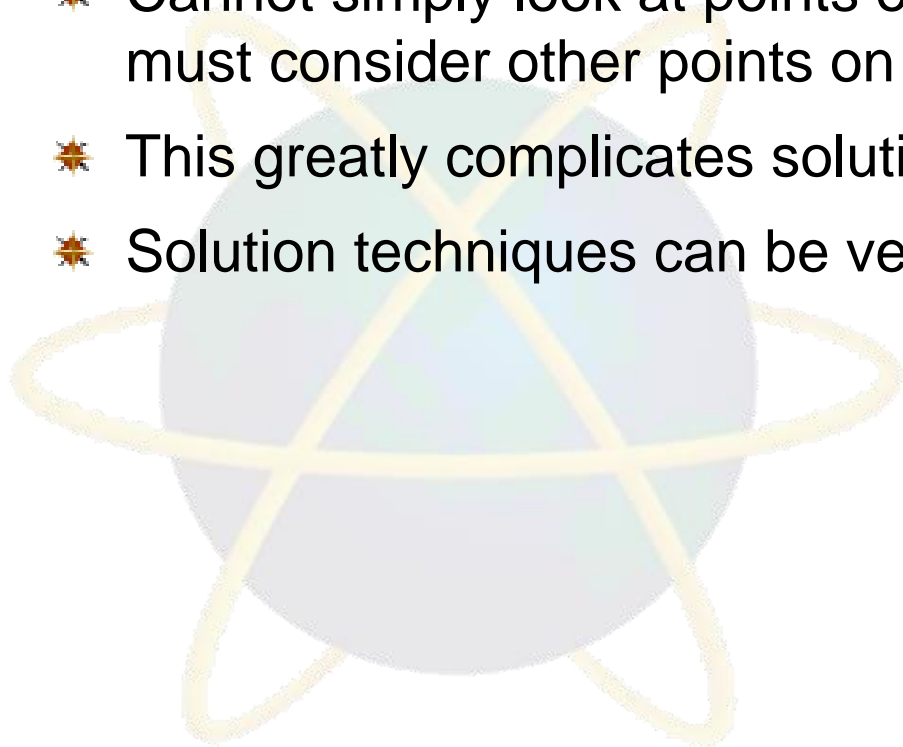
Graphical Interpretation (3 of 3)



Constrained Optimization in Nonlinear Problems

Characteristics

- ✦ Unlike linear programming, solution is often not on the boundary of the feasible solution space.
- ✦ Cannot simply look at points on the solution space boundary but must consider other points on the surface of the objective function.
- ✦ This greatly complicates solution approaches.
- ✦ Solution techniques can be very complex.



Western Clothing Company Problem Solution Using Excel

Maximize $Z = (p_1 - 12)x_1 + (p_2 - 9)x_2$

subject to:

$$2x_1 + 2.7x_2 \leq 6,00$$

$$3.6x_1 + 2.9x_2 \leq 8,500$$

$$7.2x_1 + 8.5x_2 \leq 15,000$$

where:

$$x_1 = 1,500 - 24.6p_1$$

$$x_2 = 2,700 - 63.8p_2$$

p_1 = price of designer jeans

p_2 = price of straight jeans

Western Clothing Company Problem Solution Using Excel

Microsoft Excel - Exhibit10.9

File Edit View Insert Format Tools Data Window Help

Formula bar: C5 =1500-24.6*D5

	A	B	C	D	E	F	G	H	I	J	K	L
1	Western Clothing Company											
2												
3												
4			Demand	Price	Profit							
5		Designer jeans:	1500	0.00	-12.00							
6		Straight-leg jeans:	2700	0.00	-9.00							
7				Total	-42300							
8												
9		Resource constraints:										
10		Resource	Used	Available								
11		Cloth:	10290	6000								
12		Cutting time:	13230	8500								
13		Sewing time:	33750	15000								
14												

Callout 1 (pointing to cell E5): $= D5 - 12$

Callout 2 (pointing to cell E7): $= \text{SUMPRODUCT}(C5:C6, E5:E6)$

Callout 3 (pointing to cell C5): $= 2 * C5 + 2.7 * C6$

Western Clothing Company Problem Solution Using Excel

Solver Parameters

Set Target Cell:

Equal To: ☒ Max ☐ Min ☐ Value of:

By Changing Cells:

Subject to the Constraints:

-
-

Buttons: Solve, Close, Options, Add, Change, Delete, Reset All, Help

Western Clothing Company Problem Solution Using Excel

Microsoft Excel - NLP3.xls

File Edit View Insert Format Tools Data Window Help

Arial 10 B I U \$ € % , +.00 +.00 100% ?

E7 =SUMPRODUCT(C5:C6,E5:E6)

	A	B	C	D	E	F	G	H	I	J	K	L
1	Western Clothing Company											
2												
3												
4			<i>Demand</i>	<i>Price</i>	<i>Profit</i>							
5	<i>Designer jeans:</i>	602.4	36.49	24.49								
6	<i>Straight-leg jeans:</i>	1062.9	25.66	16.66								
7				<i>Total=</i>	32459.23							
8												
9	<i>Resource constraints:</i>											
10		<i>Resource</i>	<i>Used</i>	<i>Available</i>								
11		<i>Cloth:</i>	4074.63	6000								
12		<i>Cutting time:</i>	5251.05	8500								
13		<i>Sewing time:</i>	13371.93	15000								
14												

Facility Location Example Problem

Problem Definition and Data (1 of 2)

Centrally locate a facility that serves several customers or other facilities in order to minimize distance or miles traveled (d) between facility and customers.

$$d_i = \text{sqrt}((x_i - x)^2 + (y_i - y)^2) \quad (= \text{straight-line distance})$$

Where:

(x, y) = coordinates of proposed facility

(x_i, y_i) = coordinates of customer or location facility i

Minimize total miles $d = \sum d_i t_i$

Where:

d_i = distance to town i

t_i = annual trips to town i

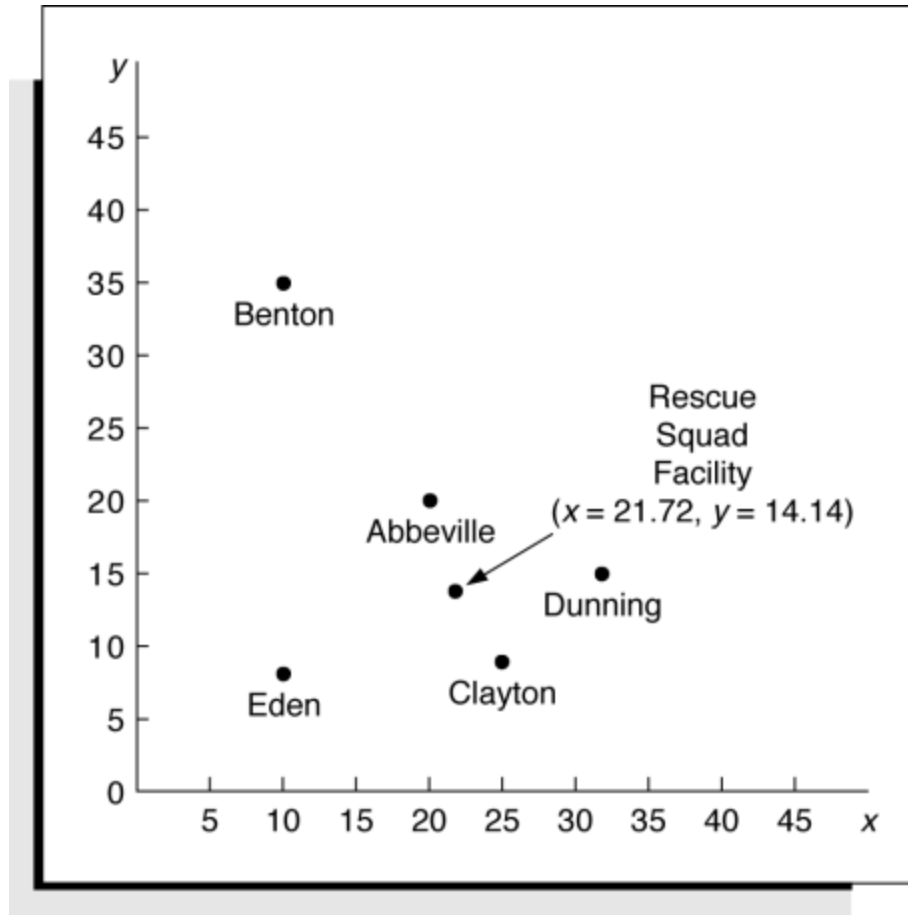
Facility Location Example Problem

Problem Definition and Data (2 of 2)

Town	Coordinates		Annual Trips
	x	y	
Abbeville	20	20	75
Benton	10	35	105
Clayton	25	9	135
Dunnig	32	15	60
Eden	10	8	90

Facility Location Example Problem

Solution Map



Investment Portfolio Selection Example Problem

Definition and Model Formulation (1 of 2)

- ✦ Objective of the portfolio selection model is to minimize some measure of portfolio risk (variance in the return on investment) while achieving some specified minimum return on the total portfolio investment.
- ✦ Since variance is the sum of squares of differences, it is *mathematically identical* to the “straight-line distance”! Thus, it is possible to visualize variances as such distances, and minimizing the overall variance is then *mathematically identical* to minimizing such distances.

Investment Portfolio Selection Example Problem

Definition and Model Formulation (2 of 2)

$$\text{Minimize } S = \underbrace{x_1^2 s_1^2 + x_2^2 s_2^2 + \dots + x_n^2 s_n^2}_{\text{"straight-line distance"}} + \sum x_i x_j r_{ij} s_i s_j$$

where:

S = variance of annual return of the portfolio

x_i, x_j = the proportion of money invested in investments i or j

s_i^2 = the variance for investment i

r_{ij} = the correlation between returns on investments i and j

s_i, s_j = the std. dev. of returns for investments i and j

subject to:

$$r_1 x_1 + r_2 x_2 + \dots + r_n x_n \geq r_m$$

$$x_1 + x_2 + \dots + x_n = 1.0$$

where:

r_i = expected annual return on investment i

r_m = the minimum desired annual return from the portfolio

Investment Portfolio Selection Example Problem

Solution Using Excel (1 of 5)

Four stocks, desired annual return of at least 0.11.

Minimize

$$\begin{aligned} Z = S = & x_A^2(.009) + x_B^2(.015) + x_C^2(.040) + x_D^2(.023) + \\ & x_A x_B (.4)(.009)^{1/2}(.015)^{1/2} + x_A x_C (.3)(.009)^{1/2}(.040)^{1/2} + \\ & x_A x_D (.6)(.009)^{1/2}(.023)^{1/2} + x_B x_C (.2)(.015)^{1/2}(.040)^{1/2} + \\ & x_B x_D (.7)(.015)^{1/2}(.023)^{1/2} + x_C x_D (.4)(.040)^{1/2}(.023)^{1/2} + \\ & x_B x_A (.4)(.015)^{1/2}(.009)^{1/2} + x_C x_A (.3)(.040)^{1/2} + (.009)^{1/2} + \\ & x_D x_A (.6)(.023)^{1/2}(.009)^{1/2} + x_C x_B (.2)(.040)^{1/2}(.015)^{1/2} + \\ & x_D x_B (.7)(.023)^{1/2}(.015)^{1/2} + x_D x_C (.4)(.023)^{1/2}(.040)^{1/2} \end{aligned}$$

subject to:

$$.08x_1 + .09x_2 + .16x_3 + .12x_4 \geq 0.11$$

$$x_1 + x_2 + x_3 + x_4 = 1.00$$

$$x_i \geq 0$$

Investment Portfolio Selection Example Problem

Solution Using Excel (2 of 5)

Stock (x_i)	Annual Return (r_i)	Variance (s_i)
Altacam	.08	.009
Bestco	.09	.015
Com.com	.16	.040
Delphi	.12	.023

Stock combination (i,j)	Correlation (r_{ij})
A,B	.4
A,C	.3
A,D	.6
B,C	.2
B,D	.7
C,D	.4

Investment Portfolio Selection Example Problem Solution Using Excel (3 of 5)

Doubling
covariances will
include all
investment pairs.

Microsoft Excel - Exhibit10.13

File Edit View Insert Format Tools Data Window Help

Arial 10 B I U

B20 = =(E6*2)*C6+(E7*2)*C7+(E8*2)*C8+(E9*2)*C9+2*(E6*E7*C14*SQRT(C6)*SQRT(C7)+E6*E8*D14*SQRT(C6)*SQRT(C8)+E6*E9*E14*SQRT(C6)*SQRT(C9)+E7*E8*D15*SQRT(C7)*SQRT(C8)+E7*E9*E15*SQRT(C7)*SQRT(C9)+E8*E9*E16*SQRT(C8)*SQRT(C9))

Jessica Todd's Investment Portfolio				
Stock	Average Return	Estimated Variance	Variables	Investment Proportion
Altacam	0.08	0.009	X1 =	
Bestco	0.09	0.015	X2 =	
Com.com	0.16	0.040	X3 =	
Delphi	0.12	0.023	X4 =	
Total desired return =	0.11		Sum =	1.000

Correlations:				
Stock	Altacam	Bestco	Com.com	Delphi
Altacam	1	0.40	0.30	0.60
Bestco	0.40	1	0.20	0.70
Com.com	0.30	0.20	1	0.40
Delphi	0.60	0.70	0.40	1

Total portfolio return =	0
Total variance =	0
Total proportion invested =	0

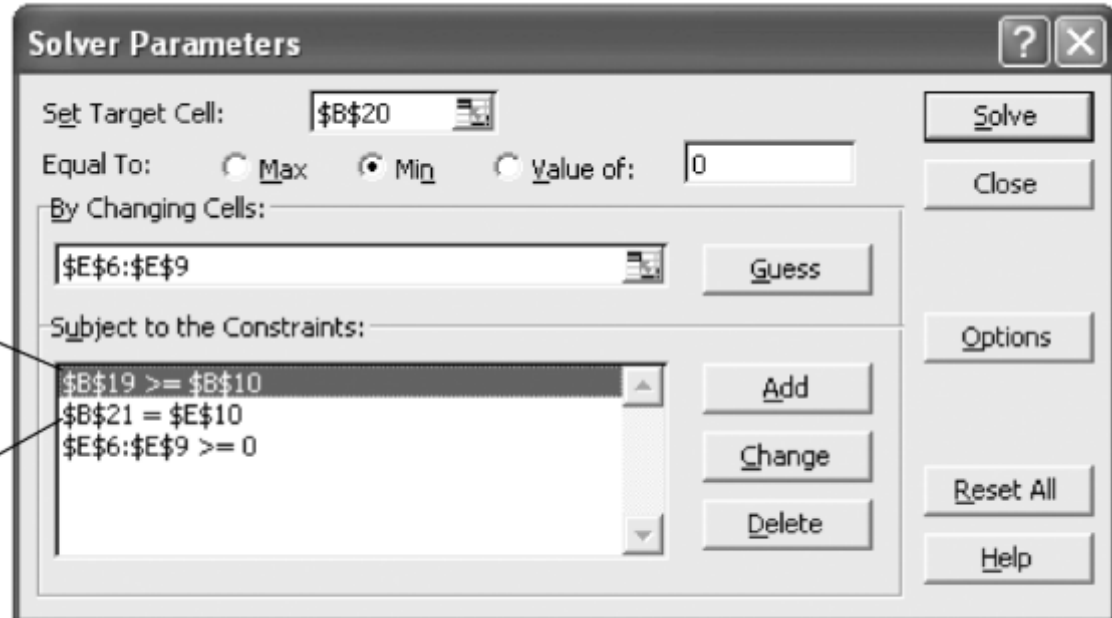
=SUM(E6:E9)

=SUMPRODUCT(B6:B9,E6:E9)

Investment Portfolio Selection Example Problem Solution Using Excel (4 of 5)

Investment return
constraint

All money is invested
constraint



Solver Parameters

Set Target Cell:

Equal To: ☐ Max ☒ Min ☐ Value of:

By Changing Cells:

Subject to the Constraints:

-
-
-

Buttons: Solve, Close, Options, Add, Change, Delete, Reset All, Help

Investment Portfolio Selection Example Problem Solution Using Excel (5 of 5)

Microsoft Excel - Ch10-NLPPortfolio.xls

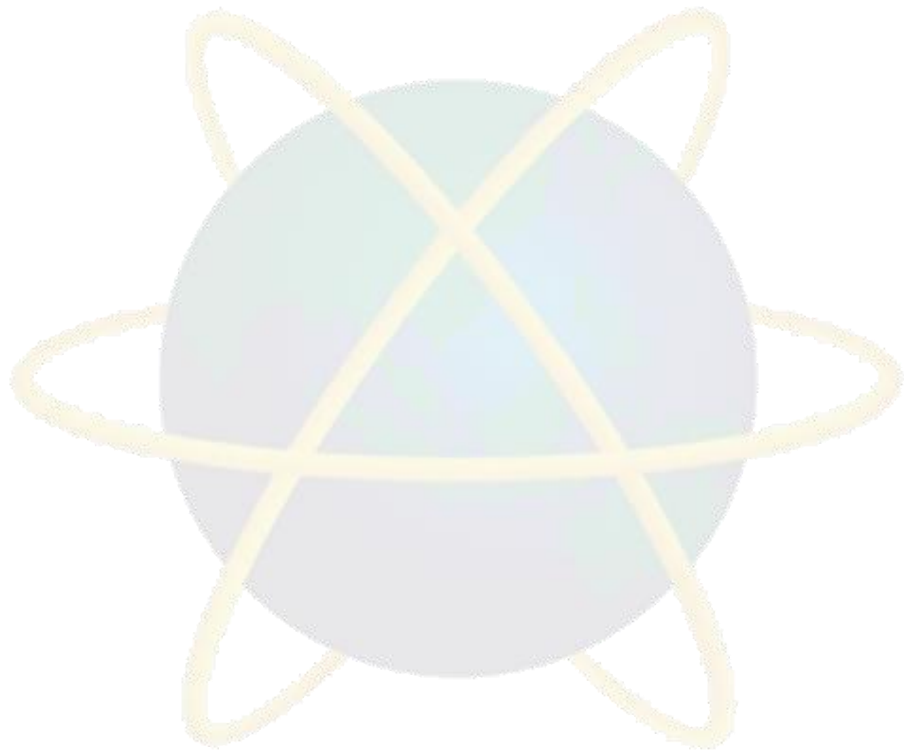
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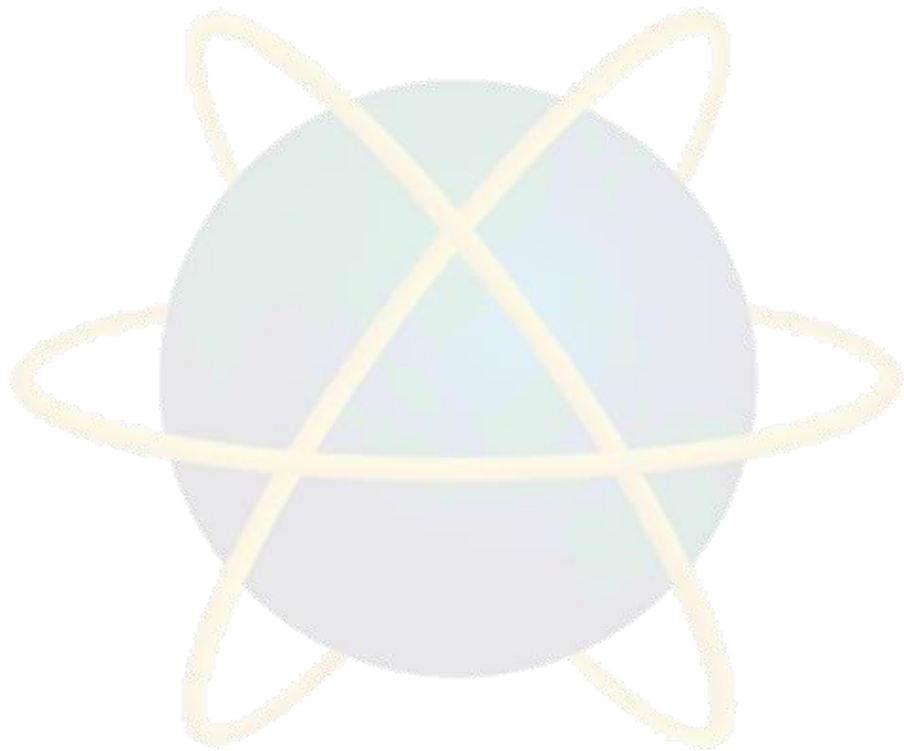
B20 =
$$=(E6^2)*C6+(E7^2)*C7+(E8^2)*C8+(E9^2)*C9+2*(E6*E7*C14*SQRT(C6)*SQRT(C7)+E6*E8*D14*SQRT(C6)*SQRT(C8)+E6*E9*E14*SQRT(C6)*SQRT(C9)+E7*E8*C15*SQRT(C7)*SQRT(C8)+E7*E9*E15*SQRT(C7)*SQRT(C9)+E8*E9*E16*SQRT(C8)*SQRT(C9))$$

Jessica Todd's Investment Portfolio					
		<i>Average</i>	<i>Estimated</i>		<i>Investment</i>
		<i>Return</i>	<i>Variance</i>	<i>Variables</i>	<i>Proportion</i>
Stock					
Altacam		0.08	0.009	X1 =	0.532
Bestco		0.09	0.015	X2 =	0.000
Com.com		0.16	0.040	X3 =	0.282
Delphi		0.12	0.023	X4 =	0.185
Total desired return =		0.11		Sum =	1.000
Covariances:					
Stock	Altacam	Bestco	Com.com	Delphi	
Altacam	1	0.40	0.30	0.60	
Bestco	0.40	1	0.20	0.70	
Com.com	0.30	0.20	1	0.40	
Delphi	0.60	0.70	0.40	1	
Total portfolio return =	0.11				
Total variance =	0.0112				
Total proportion invested =	1.00				

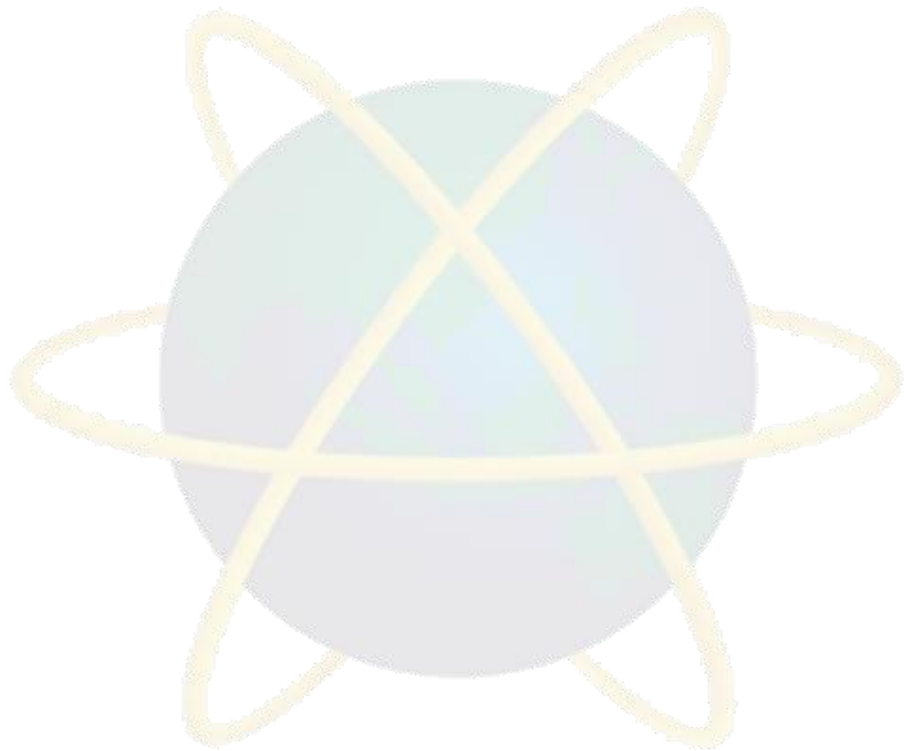
Quick Review Question



Follow Up Assignment



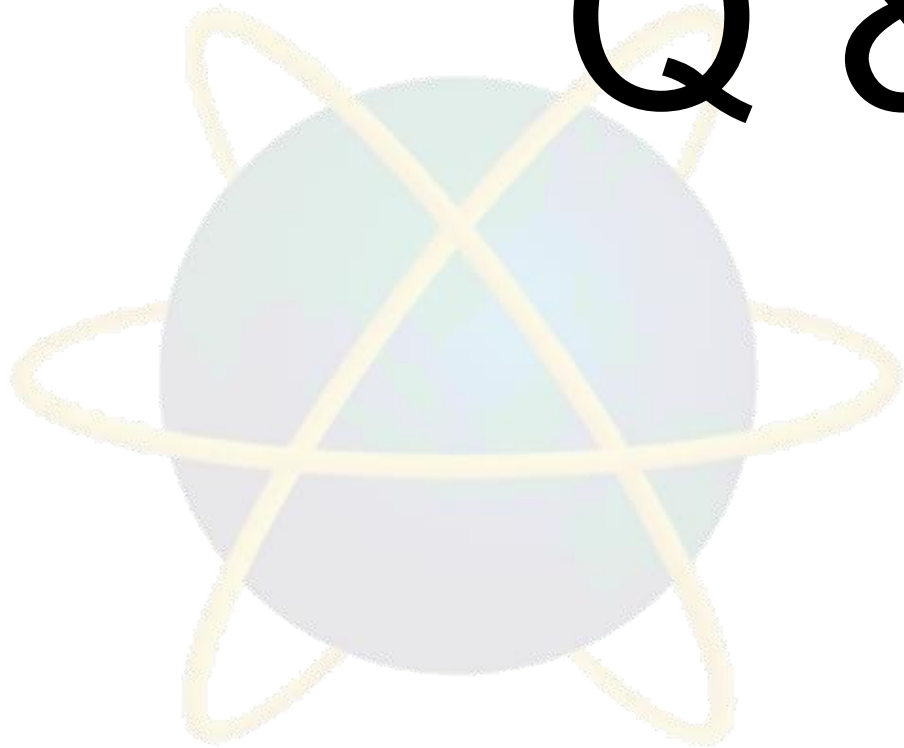
Summary of Main Teaching Points



Question and Answer Session



Q & A



Next Lesson

Network Models

