

# Non-linear Optimization

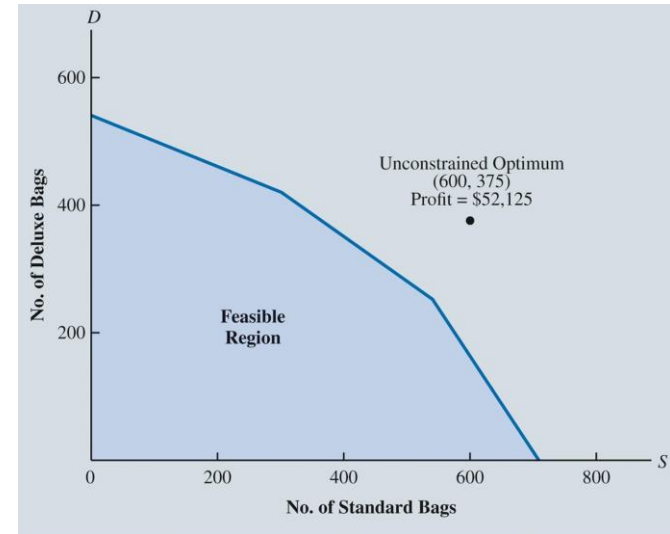
Any optimization problem in which at least one term in the **objective function or a constraint** is nonlinear.

Assuming an inverse relationship between demand and price,

$$S = 2,250 - 15P_S$$
$$D = 1,500 - 5P_D$$

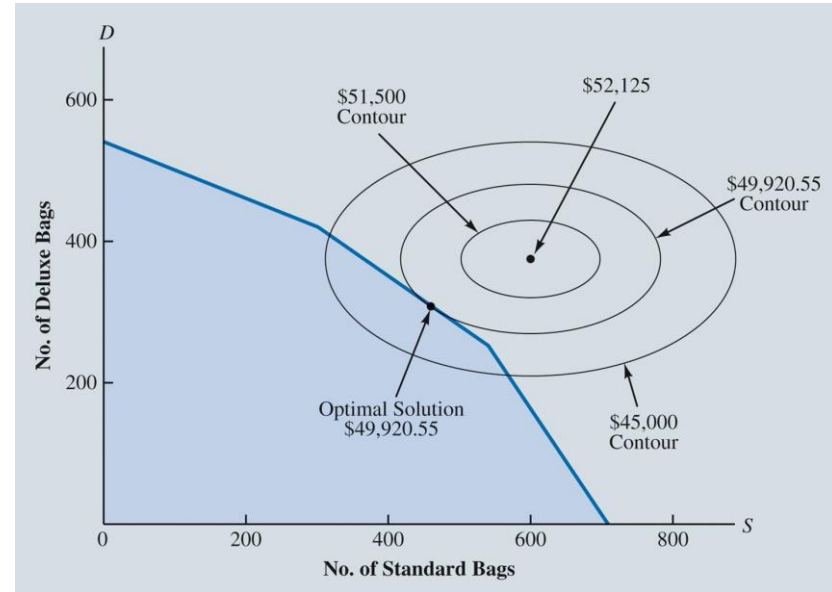
$$\text{Total profit contribution} = 80S - \left(\frac{1}{15}\right)S^2 + 150D - \left(\frac{1}{5}\right)D^2$$

Equation of an ellipse,  $\left(\frac{x}{a}\right)^2 + y^2 = 1$



# A Production Application: Par, Inc. : Unconstrained

$$\begin{array}{ll} \text{Max} & 80S - \frac{1}{15}S^2 + 150D - \frac{1}{5}D^2 \\ \text{s.t.} & \frac{7}{10}S + 1D \leq 630 \quad \text{Cutting and dyeing} \\ & \frac{1}{2}S + \frac{5}{6}D \leq 600 \quad \text{Sewing} \\ & 1S + \frac{2}{3}D \leq 708 \quad \text{Finishing} \\ & \frac{1}{10}S + \frac{1}{4}D \leq 135 \quad \text{Inspection and packaging} \\ & S, D \geq 0 \end{array}$$



# Sensitivity and Shadow prices

- **Reduced gradient & Lagrange multiplier**
  - The reduced cost/gradient for a variable is nonzero only when the variable's value is equal to its upper or lower bound at the optimal solution.
  - Non-critical constraints will have zero shadow prices as slack (*amount by which a resource is under-utilized*) exists already.

	A	B	C	D	E	F
4						
5						
6						
7						
8						
9						
10						
11						
12						
13						
14						
15						
16						
17						
18						
19						

Variable Cells			
Cell	Name	Final Value	Reduced Gradient
\$B\$14	Bags Produced Standard	459.7166	0
\$C\$14	Bags Produced Deluxe	308.19838	0

Constraints			
Cell	Name	Final Value	Lagrange Multiplier
\$B\$19	Cutting and Dyeing Hours Used	630	26.720587
\$B\$20	Sewing Hours Used	486.69028	0
\$B\$21	Finishing Hours Used	665.18219	0
\$B\$22	Inspection and Packaging Hours Used	123.02126	0



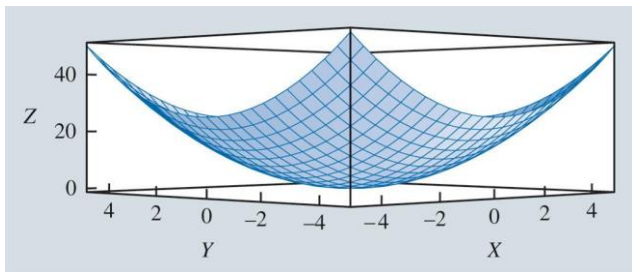
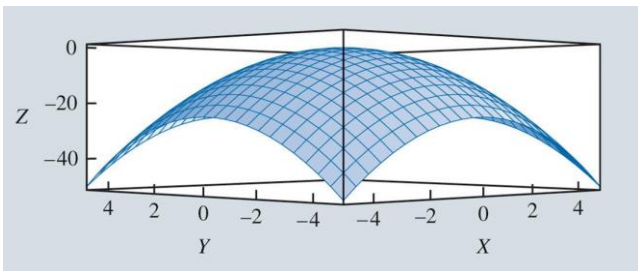
# Local and Global optima

- **Local optimum:** A feasible solution when there are no other feasible solutions with a better objective function value in the immediate neighborhood; may be either a local maximum or a local minimum.
  - **Local maximum:** A feasible solution when there are no other feasible solutions with a larger objective function value in the immediate neighborhood.
  - **Local minimum:** A feasible solution when there are no other feasible solutions with a smaller objective function value in the immediate neighborhood.
- **Global optimum:** A feasible solution when there are no other feasible points with a better objective function value in the entire feasible region; may be either a global maximum or a global minimum.
  - **Global maximum:** A feasible solution when there are no other feasible points with a larger objective function value in the entire feasible region; also a local maximum.
  - **Global minimum:** A feasible solution when there are no other feasible points with a smaller objective function value in the entire feasible region; also a local minimum.

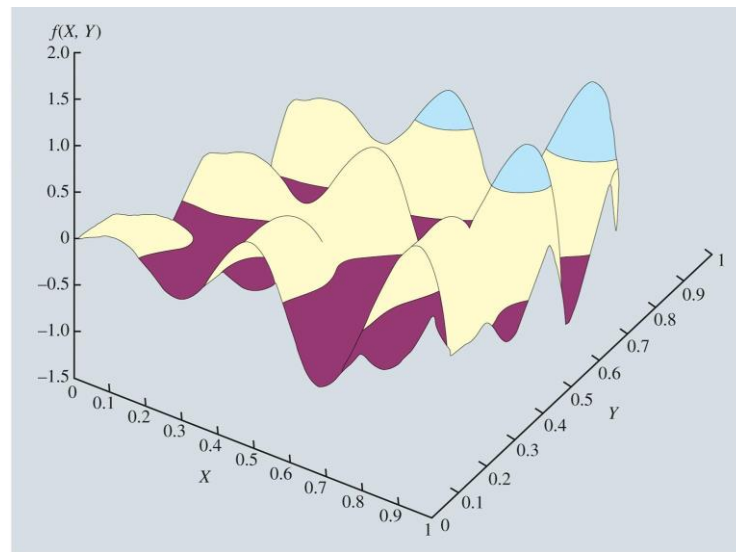


# Local and Global optima

$$f(X,Y) = -X^2 - Y^2$$



$$f(X,Y) = X^2 + Y^2$$



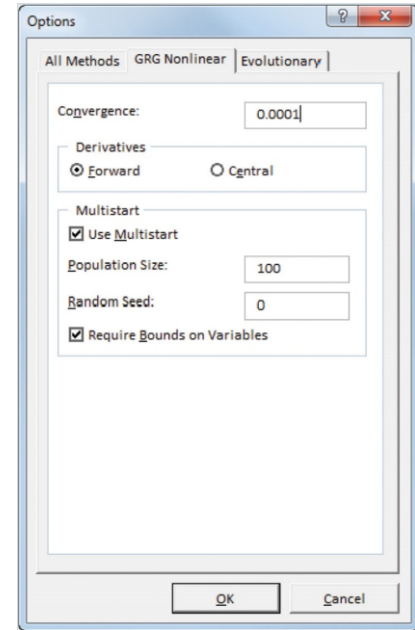
$$\begin{aligned} \text{Max } f(X,Y) &= X \sin(5\pi X) + Y \sin(5\pi Y) \\ \text{s.t. } & 0 \leq X \leq 1, \quad 0 \leq Y \leq 1 \end{aligned}$$



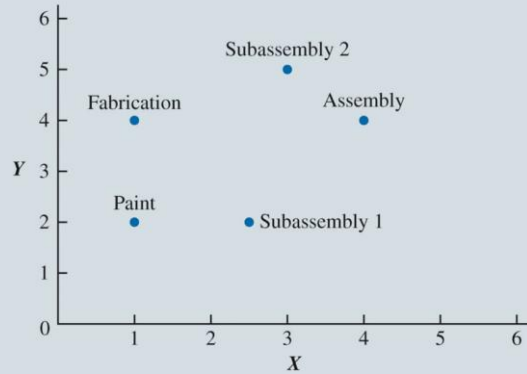
# Overcoming Local optima

Overcoming Local Optima with Excel Solver (cont.):

- Clicking the **Use Multistart** option causes Solver to use multiple starting solutions and report the best solution found from all of the starting points.
- The **Population Size** is the number of starting points used.
- Solver selects starting points randomly using the **Random Seed** (an integer value) such that the points are within the bounds specified.
- Although providing simple lower and upper bounds is not required (unless the Bounds on Variables option is selected), the procedure is much more effective when bounds are provided.
- Recommend selecting the **Require Bounds** on Variables checkbox and providing bounds before you use the Multistart option.



# A Location problem (LaRosa Machine Shop)



Station	Location	
	X	Y
Fabrication	1	4
Paint	1	2
Subassembly 1	2.5	2
Subassembly 2	3	5
Assembly	4	4

Decision variables:

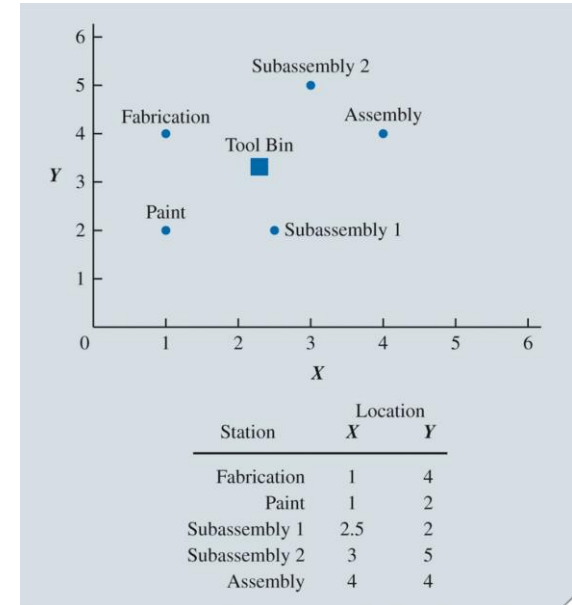
- $X$  = horizontal location of the tool bin.
- $Y$  = vertical location of the tool bin.

$$\begin{aligned} \text{Min } & \left( \sqrt{(X-1)^2 + (Y-4)^2} + \sqrt{(X-1)^2 + (Y-2)^2} + \sqrt{(X-2.5)^2 + (Y-2)^2} \right. \\ & \left. + \sqrt{(X-3)^2 + (Y-5)^2} + \sqrt{(X-4)^2 + (Y-4)^2} \right) \end{aligned}$$



# A Location problem

- Note that we do not require that the variables  $X$  or  $Y$  be non-negative.
- The optimal solution found by Excel Solver is  $X = 2.230$ ,  $Y = 3.349$ .
- Location models are used for determining the optimal locations for:
  - Drilling holes in computer circuit boards.
  - Locating distribution centers and retail stores in supply chains.
- A variety of different location models can be created by using different objective functions or by adding additional constraints on distances traveled.





# Markowitz Portfolio Model

Mutual Fund	Annual Return (%)				
	Year 1	Year 2	Year 3	Year 4	Year 5
Foreign Stock	10.06	13.12	13.47	45.42	-21.93
Intermediate-Term Bond	17.64	3.25	7.51	-1.33	7.36
Large-Cap Growth	32.41	18.71	33.28	41.46	-23.26
Large-Cap Value	32.36	20.61	12.93	7.06	-5.37
Small-Cap Growth	33.44	19.40	3.85	58.68	-9.02
Small-Cap Value	24.56	25.32	-6.70	5.43	17.31

$FS$  = Proportion of portfolio invested in the foreign stock mutual fund.

$IB$  = Proportion of portfolio invested in the intermediate-term bond fund.

$LG$  = Proportion of portfolio invested in the large-cap growth fund.

$LV$  = Proportion of portfolio invested in the large-cap value fund.

$SG$  = Proportion of portfolio invested in the small-cap growth fund.

$SV$  = Proportion of portfolio invested in the small-cap value fund.



# Markowitz Portfolio Model

$$FS + IB + LG + LV + SG + SV = 1$$

[sum of all investment proportions]

$$\bar{R} = \sum_{s=1}^n p_s R_s$$

Expected return

$$\bar{R} = \sum_{s=1}^5 \frac{1}{5} R_s = \frac{1}{5} \sum_{s=1}^5 R_s$$

Assuming equal probability of each of the scenarios

$$Var = \sum_{s=1}^5 \frac{1}{5} (R_s - \bar{R})^2$$

$$\text{Min } \frac{1}{5} \sum_{s=1}^5 (R_s - \bar{R})^2$$

Minimizing risk [variance]



# Markowitz Portfolio Model

s.t.

$$10.06FS + 17.64IB + 32.41LG + 32.36LV + 33.44SG + 24.56SV = R_1 \quad (14.9)$$

$$13.12FS + 3.25IB + 18.71LG + 20.61LV + 19.40SG + 25.32SV = R_2 \quad (14.10)$$

$$13.47FS + 7.51IB + 33.28LG + 12.93LV + 3.85SG - 6.70SV = R_3 \quad (14.11)$$

$$45.42FS - 1.33IB + 41.46LG + 7.06LV + 58.68SG + 5.43SV = R_4 \quad (14.12)$$

$$-21.93FS + 7.36IB - 23.26LG - 5.37LV - 9.02SG + 17.31SV = R_5 \quad (14.13)$$

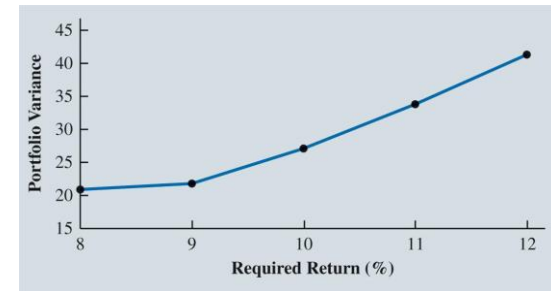
$$FS + IB + LG + LV + SG + SV = 1 \quad (14.14)$$

$$\frac{1}{5} \sum_{s=1}^5 R_s = \bar{R} \quad (14.15)$$

$$\bar{R} \geq 10 \quad (14.16)$$

$$FS, IB, LG, LV, SG, SV \geq 0 \quad (14.17)$$

Efficient frontier



- The minimum value for the portfolio variance is 27.136.
- This solution implies that the clients will get an expected return of 10% and minimize their risk as measured by portfolio variance by investing approximately:
  - 16% of the portfolio in the foreign stock fund ( $FS = 0.158$ ), 53% in the intermediate bond fund ( $IB = 0.525$ ), 4% in the large-cap growth fund ( $LG = 0.042$ ), 27% in the small-cap value fund ( $SV = 0.274$ ).

