



Lecture 21

Produced by Dr. Worldwide
Welcome to the 305

Multiple Maxima/Minima



- When solving non-linear problems, it is important to consider the possibility that there may be multiple **local** solutions (maxima/minima)
- There is no method that guarantees we find all such points
- In problems not guaranteed to have a unique interior optimal solution, it is a good idea to run the GRG algorithm starting at **several** initial points
- Consider the following nonlinear problem

Maximize $f(x) = 1 + x + \sqrt{x} \sin(2x)$

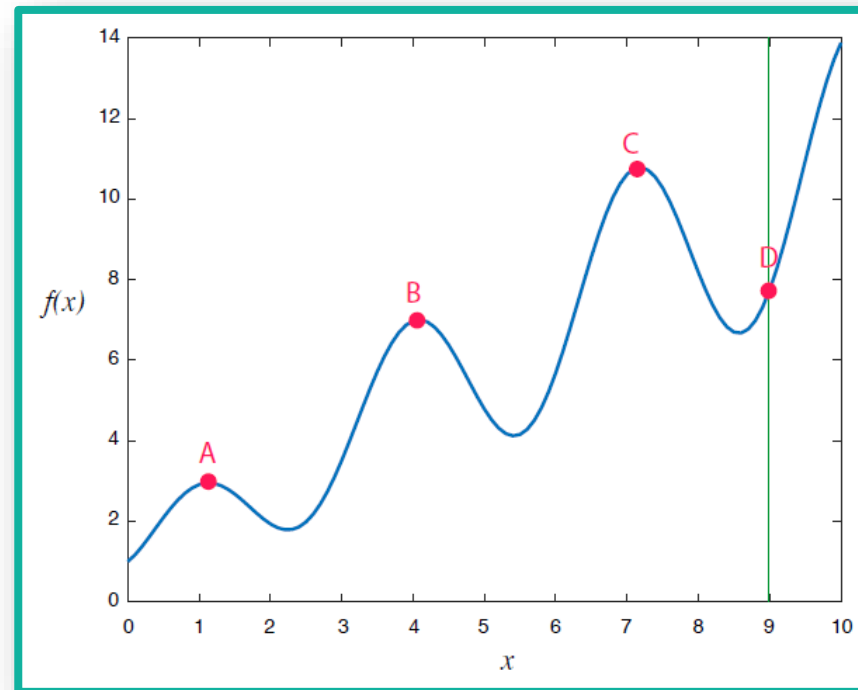
Subject to $0 \leq x \leq 9$



Multiple Maxima/Minima



- Consider the graph
 $f(x) = 1 + x + \sqrt{x} \sin(2x)$
 - Four different local maxima
 - Q: What is the answer to our problem?
- Maximize $f(x) = 1 + x + \sqrt{x} \sin(2x)$
- Subject to $0 \leq x \leq 9$



Multiple Maxima/Minima



- Download [MultipleMaxima.xlsx](#) from link [Sheet 1](#) on course website
- Consider the following part of the spreadsheet

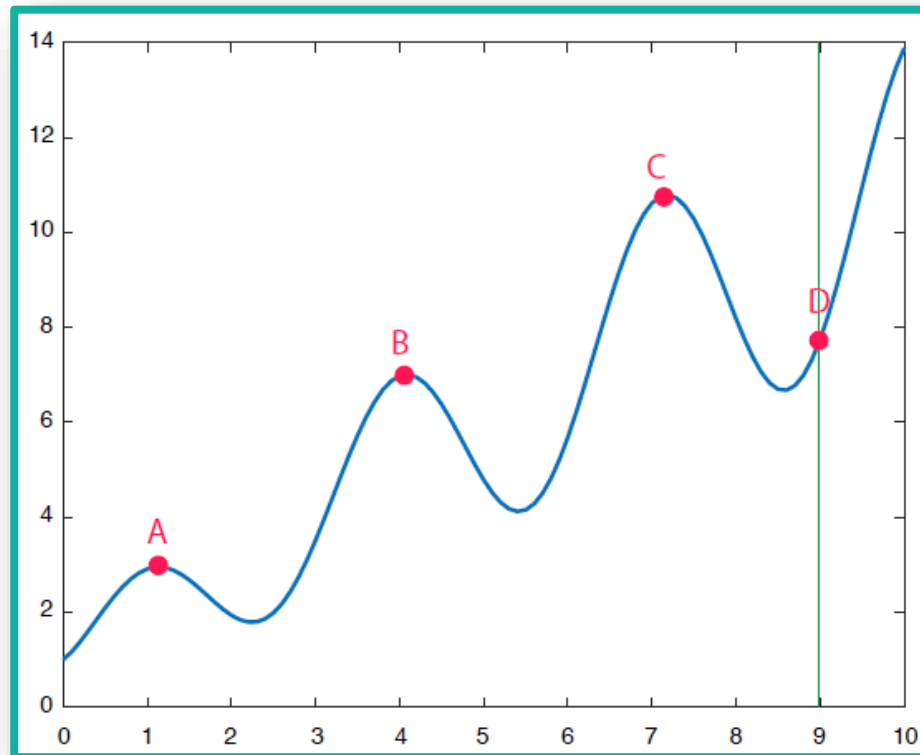
26	Starting Value	Objective Function
27	0	1

- Run solver with four different starting values
 $x = 0,$ $x = 4,$ $x = 8,$ $x = 9$
- Q: Do all four starting values lead to the same solution?

Multiple Maxima/Minima



- Optimal solution under all initial values
- Q: Do the answers make sense?

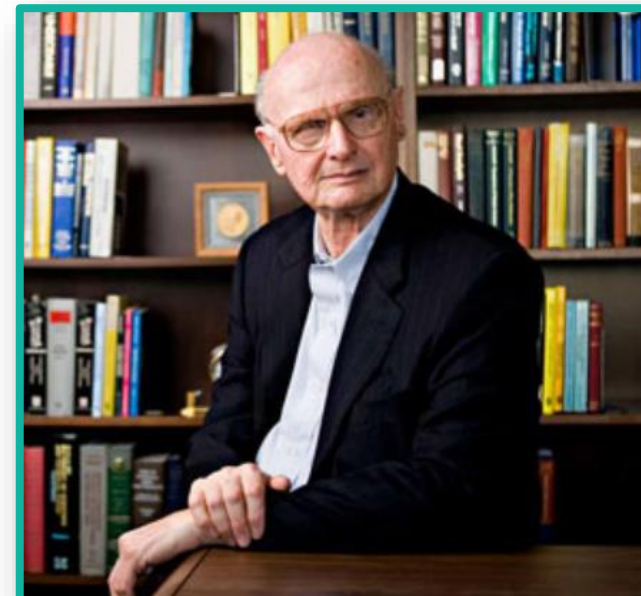


Starting Values	Optimal Solution	Maxima
0	1.13	2.95
4	4.08	7.01
8	7.18	10.79
9	9	7.75

Ex: Investment Portfolio



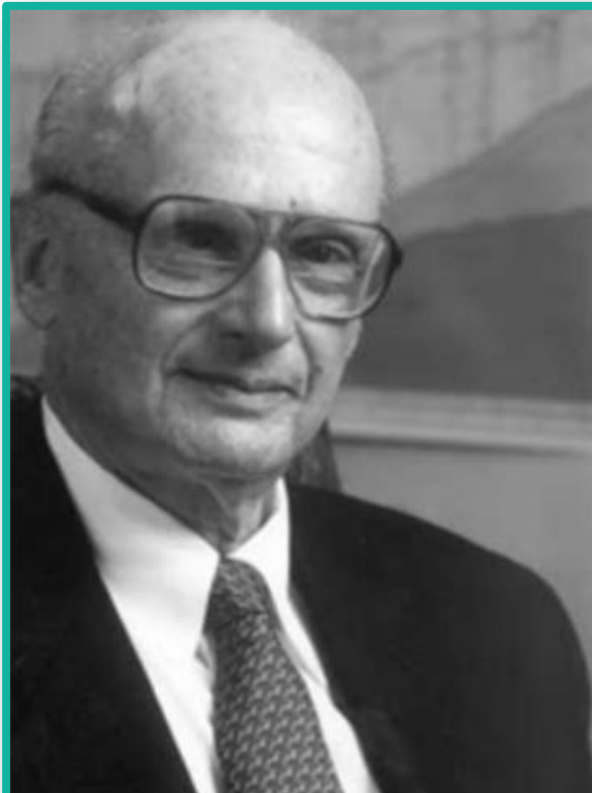
- An investor can choose among n different investment opportunities
- An **investment portfolio** is a selection of how much to invest in each option
- Popular model for portfolios is the Markowitz model
 - Minimize risk (variance of the portfolio)
 - Maximize return on investment
- Different investments are assumed to be **correlated**
 - Positively correlated
 - Negatively correlated
- **Diversification** protects against these correlations



Ex: Investment Portfolio



- Dope quote from Harry Markowitz



A good portfolio is more than a long list of good stocks and bonds. It is a balanced whole, providing the investor with protections and opportunities with respect to a wide range of contingencies.

— *Harry Markowitz* —

AZ QUOTES



Ex: Investment Portfolio



- Let x_i denote the proportion of money invested in option $i \in \{1, 2, \dots, n\}$
- Let σ_i^2 denote the variance of investment option $i \in \{1, 2, \dots, n\}$
- Let ρ_{ij} denote the correlation between investment option $i \in \{1, 2, \dots, n\}$ and investment option $j \in \{1, 2, \dots, n\}$ where $i \neq j$
- The **variance** of the portfolio is given by

$$S = x_1^2 \sigma_1^2 + x_2^2 \sigma_2^2 + \dots + x_n^2 \sigma_n^2 + \sum_{i=1}^n \sum_{1 \leq j \leq n, j \neq i} x_i x_j \rho_{ij} \sigma_i \sigma_j$$
$$= (x_1, x_2, \dots, x_n) \begin{bmatrix} \sigma_1^2 & \rho_{12} \sigma_1 \sigma_2 & \dots & \rho_{1n} \sigma_1 \sigma_n \\ \rho_{21} \sigma_2 \sigma_1 & \sigma_2^2 & \dots & \rho_{2n} \sigma_2 \sigma_n \\ \vdots & \vdots & \dots & \vdots \\ \rho_{n1} \sigma_n \sigma_1 & \rho_{n2} \sigma_n \sigma_2 & \dots & \sigma_n^2 \end{bmatrix} \begin{pmatrix} x_1 \\ x_2 \\ \vdots \\ x_n \end{pmatrix}$$

Ex: Investment Portfolio



- Let r_i denote the expected return on investment of option $i \in \{1, 2, \dots, n\}$
- Expected **return** on investment from the portfolio is given by

$$R = r_1x_1 + r_2x_2 + \dots + r_nx_n = (r_1, r_2, \dots, r_n) \begin{pmatrix} x_1 \\ x_2 \\ \vdots \\ x_n \end{pmatrix}$$

- Vector/Matrix notation
 - $\mathbf{x}' = [x_1, x_2, \dots, x_n]$ (Vector of decision variables of portfolio)
 - $\mathbf{r}' = [r_1, r_2, \dots, r_n]$ (Vector of expected returns)

- $\Sigma = \begin{bmatrix} \sigma_1^2 & \rho_{12}\sigma_1\sigma_2 & \dots & \rho_{1n}\sigma_1\sigma_n \\ \rho_{21}\sigma_2\sigma_1 & \sigma_2^2 & \dots & \rho_{2n}\sigma_2\sigma_n \\ \vdots & \vdots & \dots & \vdots \\ \rho_{n1}\sigma_n\sigma_1 & \rho_{n2}\sigma_n\sigma_2 & \dots & \sigma_n^2 \end{bmatrix}$ (Variance/covariance matrix)

Ex: Investment Portfolio



- The nonlinear program we desire to solve

Minimize $\mathbf{x}'\Sigma\mathbf{x}$

Subject to $\mathbf{r}'\mathbf{x} \geq r_m$
 $x_1 + x_2 + \cdots + x_n = 1$
 $x_i \geq 0$

- Objective function is nonlinear and quadratic
- Q: What are the units of the different values x_1, x_2, \dots, x_n ?
- Q: What does r_m represent in this linear program?

Ex: Investment Portfolio



- Suppose an investor wants to build a portfolio from the following stocks:

Stock (x_i)	Annual return (r_i)	Variance
1. Altacam	.08	.009
2. Bestco	.09	.015
3. Com.com	.16	.040
4. Delphi	.12	.023

- Consider the correlation matrix of the stocks

$$\begin{bmatrix} 1 & \rho_{12} & \rho_{13} & \rho_{14} \\ \rho_{21} & 1 & \rho_{23} & \rho_{24} \\ \rho_{31} & \rho_{32} & 1 & \rho_{34} \\ \rho_{41} & \rho_{42} & \rho_{43} & 1 \end{bmatrix} = \begin{bmatrix} 1 & .4 & .3 & .6 \\ .4 & 1 & .2 & .7 \\ .3 & .2 & 1 & .4 \\ .6 & .7 & .4 & 1 \end{bmatrix}$$

Ex: Investment Portfolio



- The **covariance** matrix can be computed as follows:

$$\Sigma = \begin{bmatrix} \sigma_1^2 & \rho_{12}\sigma_1\sigma_2 & \rho_{13}\sigma_1\sigma_3 & \rho_{14}\sigma_1\sigma_4 \\ \rho_{21}\sigma_2\sigma_1 & \sigma_2^2 & \rho_{23}\sigma_2\sigma_3 & \rho_{24}\sigma_2\sigma_4 \\ \rho_{31}\sigma_3\sigma_1 & \rho_{32}\sigma_3\sigma_2 & \sigma_3^2 & \rho_{34}\sigma_3\sigma_4 \\ \rho_{41}\sigma_4\sigma_1 & \rho_{42}\sigma_4\sigma_2 & \rho_{43}\sigma_4\sigma_3 & \sigma_4^2 \end{bmatrix}$$
$$= \begin{bmatrix} 0.009 & 0.00464758 & 0.0056921 & 0.008632497 \\ 0.00464758 & 0.015 & 0.004898979 & 0.013001923 \\ 0.0056921 & 0.004898979 & 0.04 & 0.012132601 \\ 0.008632497 & 0.013001923 & 0.012132601 & 0.023 \end{bmatrix}$$

- The investor wants a total annual return of at least 0.11 (11%)
- Download [Markowitz.xlsx](#) from link [Sheet 2](#) on course website

Ex: Investment Portfolio



- Notice the formula for the objective function

21	Computing the portfolio variance:	
22	$x' * \text{Sigma} * x =$	0
23		
24	Portfolio variance:	0

$= \text{SUMPRODUCT}(B4:B7, \text{MMULT}(A16:D19, B4:B7))$

- Try the alternative approach
 $= \text{MMULT}(\text{TRANSPOSE}(B4:B7), \text{MMULT}(A16:D19, B4:B7))$
- Examine what the constraints look like in Solver

Subject to the Constraints:

$\$B\$25 \geq 0.11$

$\$B\$26 = 1$

Ex: Admissions at State



- State has increased its tuition for all students in each of the last 5 years
- University administration always thought the number of applications received was independent of tuition
- Drops in applications and enrollment prove this idea to be wrong
- University admissions officials developed the following relationships between the number of applicants (x_i) and cost of tuition (t_i)
$$x_1 = 21000 - 12t_1 \quad \text{(Relationship for in-state applicants)}$$
$$x_2 = 35000 - 6t_2 \quad \text{(Relationship for out-of-state applicants)}$$
- University desires to develop a planning model to indicate the in-state and out-of-state tuitions, as well as, the number of students that could be expected to enroll in the freshman class

Ex: Admissions at State



- Constraints based on resources
 - Not enough classroom space for more than 1,400 students
 - Needs at least 700 freshmen to meet all its class size objectives
 - At most 800 dorm rooms available for freshmen
- Historical expectations
 - 55% of all in-state freshmen desire to live in dorms
 - 72% of all out-of-state freshmen desire to live in dorms
- Uphold the academic standards of the institution
 - Average SAT is 960 for in-state students
 - Average SAT is 1150 for out-of-state students
 - University wants the entering freshmen to average 1,000



Ex: Admissions at State



- Legislative requirements
 - State is supported by the state LOL 😊
 - The legislature wants to make sure that State doesn't just admit out-of-state students because they pay more money or have better SAT scores
 - Policy that no more than 55% of the entering freshman can be out-of-state students
- Q: How much should State charge, what would the total tuition be, and how many in-state and out-of-state students should they expect?
- Decision variables
 - We have a choice between x_1 and x_2 or t_1 and t_2
 - Related through the following equations
$$x_1 = 21000 - 12t_1$$
$$x_2 = 35000 - 6t_2$$

Ex: Admissions at State



- Objective function
 - Goal is to maximize the revenue in tuition
 - Total tuition based off in-state and out-of-state students

$$x_1 t_1 + x_2 t_2 = x_1 \times \frac{(21000 - x_1)}{12} + x_2 \times \frac{(35000 - x_2)}{6}$$

- Constraints
 - Maximum number of freshmen
 $x_1 + x_2 \leq 1400$



The End



Dale

