

# 최적화 기법

# Optimization Technique

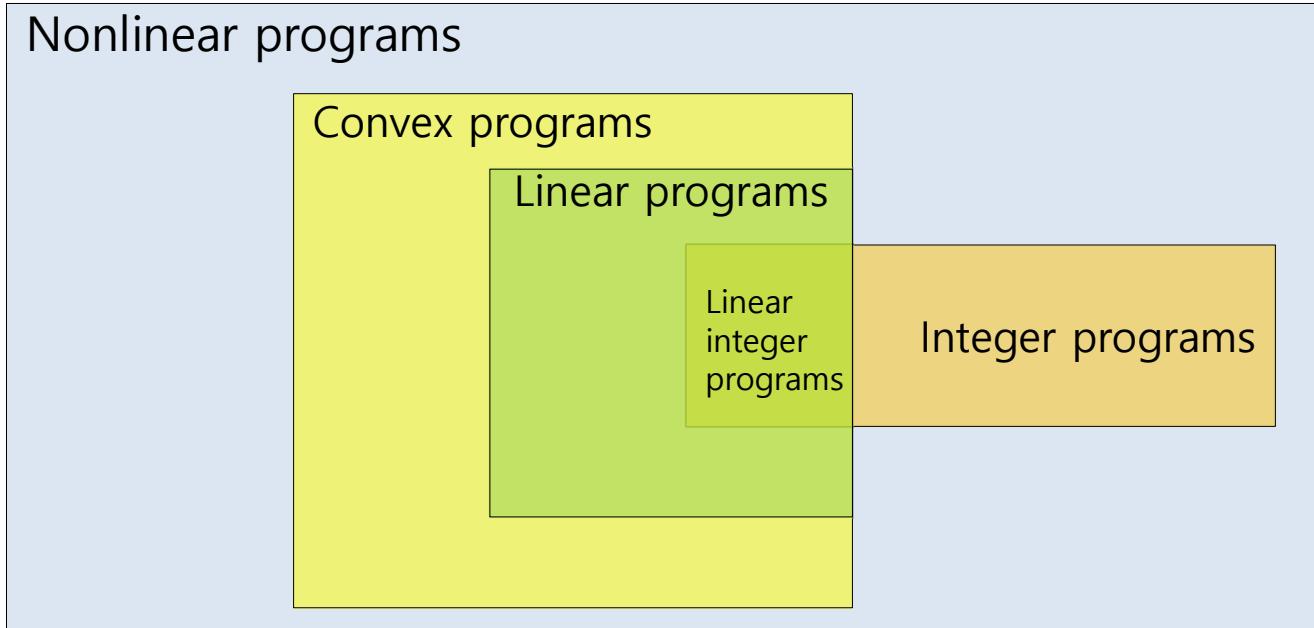
# Optimization Problems

- General problem: nonlinear programming

Find  $x$

$$\begin{array}{ll} \text{Minimize} & f(x) \\ \text{Subject to} & g_i(x) \geq 0 \quad i = 1, \dots, m \\ & h_j(x) = 0 \quad j = 1, \dots, p \end{array}$$

$f, g_i, h_j$  : general functions of the parameter  $x \in R^n$



# Optimization Problems

Programs	$f$	$g_i$	$h_j$	$x$	특징
Nonlinear program	nonlinear	nonlinear	nonlinear	$R^n$	
Convex program	convex	concave	linear	$R^n$	
Linear Program	linear	linear	linear	$R^n$	
Integer Program	nonlinear	nonlinear	nonlinear	$I^n$	
Linear Integer Program	Linear	linear	linear	$I^n$	

# Optimization Problems

- Car manufacturing problem

- Car model A, B

Car	Assembly	Finishing	Profit
A	4 h	6 h	400 \$
B	6 h	3 h	300 \$

- Supply Constraints

Available assembly time: 720 h

Available finishing time: 480 h

- Demand Constraints

A : 20 대 이상

B : 30 대 이상

➤ 최대 profit 을 위한 model A, B 의 생산 대수?

# Optimization Problems

- Diet problem

# Convex Function

- Convex combination

Given two points  $x, y \in R^n$ ,  
a convex combination is any point of the form  
$$z = \lambda x + (1 - \lambda)y, \quad \lambda \in R^1 \text{ and } 0 \leq \lambda \leq 1$$

- Convex set

A set  $S \subseteq R^n$  is convex, if it contains all convex combinations of pairs of points  $x, y \in R^n$

- Convex function

Let  $S \subseteq R^n$  be a convex set.  
The function  $c : S \rightarrow R^1$  is convex, if for any two points  $x, y \in S$ ,

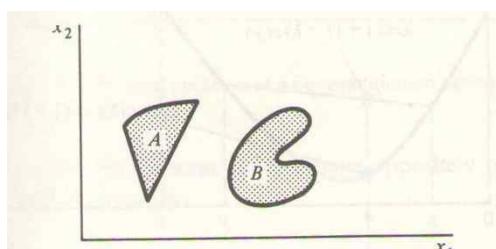
$$c(\lambda x + (1 - \lambda)y) \leq \lambda c(x) + (1 - \lambda)c(y)$$


Figure 1-7 A convex set  $A$  and a nonconvex set  $B$ .

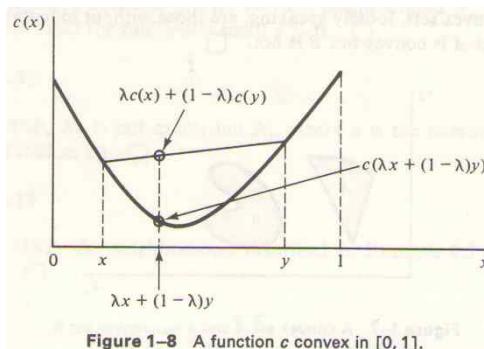


Figure 1-8 A function  $c$  convex in  $[0, 1]$ .

A function  $f$  is **concave**  
iff  $-f$  is convex

Linear function is  
a convex function

# Local & Global Optima

- Neighborhood :  $N(f)$

– 현재의 solution  $f$  주변 (이웃) 의 값들

- Local optima

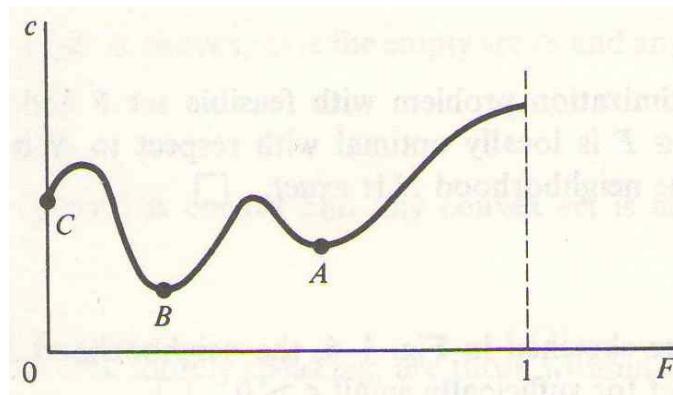
A feasible solution  $f$  is locally optimal if

$$c(f) \leq c(g) \quad \text{for all } g \in N(f)$$

- Global optimum

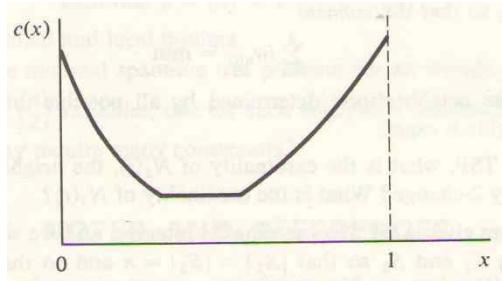
A feasible solution  $f$  is (globally) optimal if

$$c(f) \leq c(g) \quad \text{for all } g \in S$$



# Convex Programming

In a convex programming problem,  
every point locally optimal is also globally optimal.



- Linear programming problem
  - Global optimal solution ↪ simplex method
- Linear & Integer programming problem
  - Global optimal solution
  - (ex) shortest path problem: Dijkstra algorithm
  - max-flow problem: Ford-Fulkerson algorithm

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# Non-Convex Programming

- Global optimal solution 을 구하는 알고리즘이 없다
  - NP complete
- Near-optimal solution
  - 근사적 최적해 / 합리적 수준의 해
  - Traditional approach
    - Local search
    - Greedy algorithm
    - Dynamic programming
    - Branch & Bound
    - A\* algorithm
  - Modern approach
    - Simulated annealing (SA)
    - Tabu search (TS)
    - Genetic algorithm (GA)
    - Ant colony optimization (ACO)

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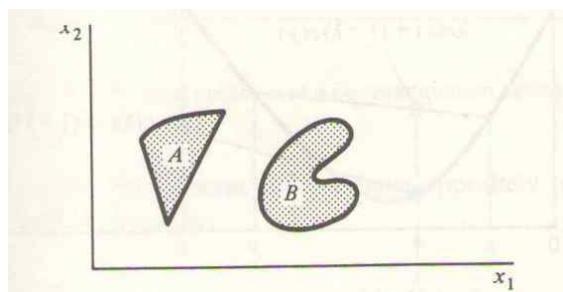


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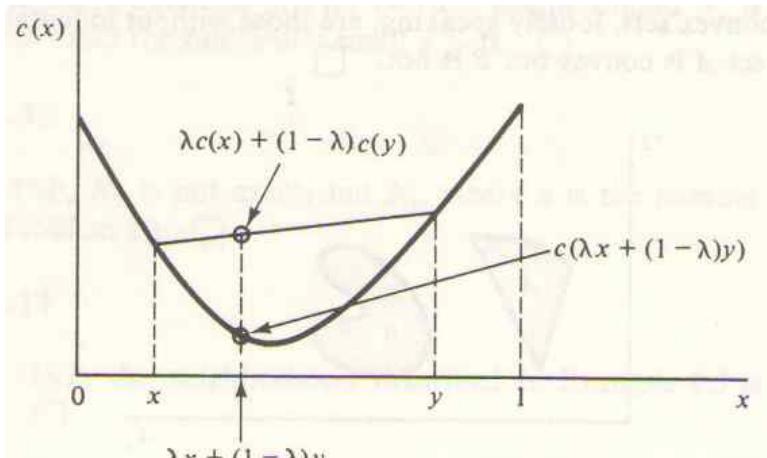
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Figure 1–8 A function  $c$  convex in  $[0, 1]$ .

A function  $f$  is **concave** iff  $-f$  is convex

Linear function is a convex function

# Convex Function

(Q) Prove that  $f(x) = x^2 + 2$  is convex function

(Sol) For  $x_1, x_2 \in R$

$$f(x_1) = x_1^2 + 2, \quad f(x_2) = x_2^2 + 2$$

$$f(\lambda x_1 + (1 - \lambda)x_2) = (\lambda x_1 + (1 - \lambda)x_2)^2 + 2$$

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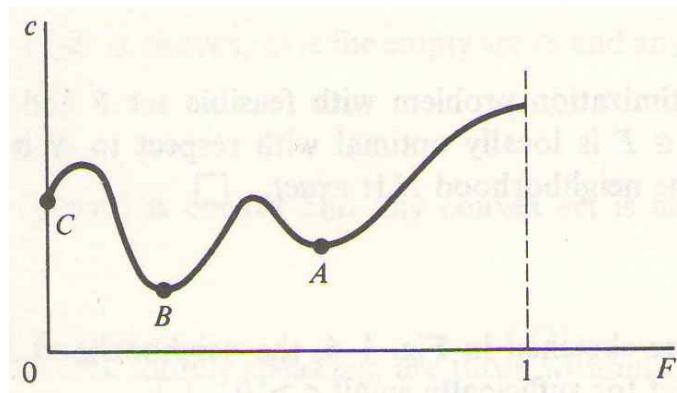
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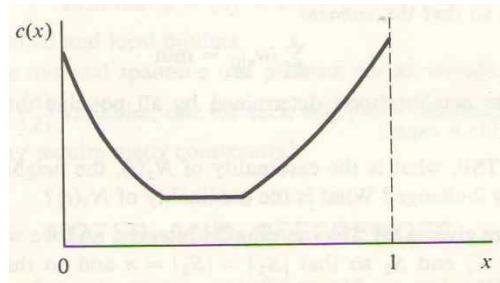
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## Nonlinear programs

Convex programs

Linear programs

Linear  
integer  
programs

Integer programs

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Zbigniew Michalewicz  
David B. Fogel

# How to Solve It: Modern Heuristics

Second Edition



Springer