

# Basic Feasible Solutions: A Quick Introduction

CS 261

WILL FOLLOW A CELEBRATED  
INTELLECTUAL TEACHING TRADITION

TONES OF USEFUL STUFF

# Men's Health

A photograph of Barack Obama, smiling and wearing a white dress shirt and a dark striped tie. He is sitting with his hands clasped in front of him.

Special Wealth & Power Issue!

## STRONG & FIT!

TRIM THE FAT IN JUST DAYS!

### 15 FLAT-BELLY POWERFOODS

### WHAT GREAT LEADERS KNOW

### MORE ENERGY—INSTANTLY!

p.116

# 1,785

### BEST EVER HEALTH, FITNESS, SEX, STYLE & NUTRITION TIPS!

### SUCCESS WITHOUT STRESS!

11 SECRET MONEY STRATEGIES

## 20 HEROES OF HEALTH & FITNESS

BARACK OBAMA, TIGER WOODS, LANCE ARMSTRONG, AND MORE

"I'm glad for high expectations. They push you to the limit—and there comes..."  
BARACK OBAMA



# TEN STEPS TOWARDS UNDERSTANDING VERTEX OPTIMALITY AND BASIC FEASIBLE SOLUTIONS

THESE SLIDES: MOSTLY INTUITION; PROOFS OMITTED

# Step 0: Notation

- Assume an LP in the following form

Maximize  $\mathbf{c}^T \mathbf{x}$

Subject to:

$$\mathbf{Ax} \leq \mathbf{b}$$

$$\mathbf{x} \geq 0$$

- N Variables, M constraints
- U = Set of all feasible solutions

# Step 1: Convex Sets and Convex Combinations

- Convex set: If two points belong to the set, then any point on the line segment joining them also belongs to the set
- Convex combination: weighted average of two or more points, such that the sum of weights is 1 and all weights are non-negative
  - Simple example: average

# Convex Combination

- Given points  $x^1, x^2, \dots, x^K$ , in  $N$  dimensions
- For any scalars  $a_1, a_2, \dots, a_K$  such that
  - Each  $a_i$  is non-negative
  - $a_1 + a_2 + \dots + a_K = 1$

$a_1x^1 + a_2x^2 + \dots + a_Kx^K$  is a convex combination of  $x^1, x^2, \dots, x^K$

# Example: Convex combination of two points

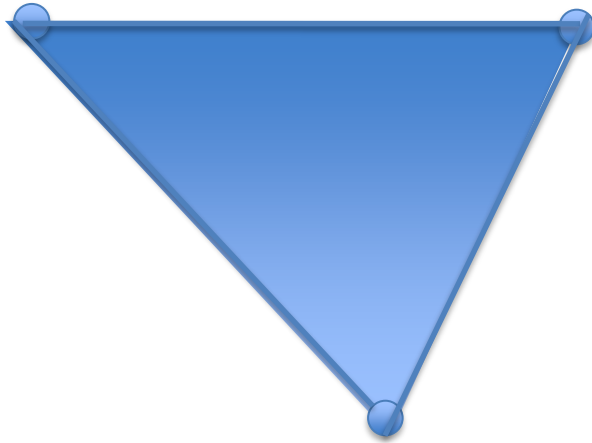




# Exercise

- If  $\mathbf{w}$  is a convex combination of  $\mathbf{x}$  and  $\mathbf{y}$ , and  $\mathbf{z}$  is a convex combination of  $\mathbf{x}$  and  $\mathbf{w}$ , then must  $\mathbf{z}$  be a convex combination of  $\mathbf{x}$  and  $\mathbf{y}$ ?

# Example: Convex combination of three points



# Exercise

Is the set of all convex combinations of  $N$  points always convex?

# Exercise

Can any convex set be represented as a convex combination of  $N$  points, for finite  $N$ ?

## Step 2: Half spaces are convex

- $\mathbf{a}^T \mathbf{x} \leq b, \mathbf{a}^T \mathbf{y} \leq b$
- Choose  $\mathbf{z} = (\mathbf{x} + \mathbf{y})/2$
- Then, we must have  $\mathbf{a}^T \mathbf{z} \leq b$

## Step 3: Intersection of convex sets is convex

- Two convex sets  $S, T$
- Suppose  $\mathbf{x}, \mathbf{y}$  both belong to  $S \cap T$
- $\mathbf{z} = (\mathbf{x} + \mathbf{y})/2$ 
  - (1)  $\mathbf{z}$  belongs to  $S$  since  $S$  is convex
  - (2)  $\mathbf{z}$  belongs to  $T$  since  $T$  is convex
- Hence,  $\mathbf{z}$  belongs to  $S \cap T$
- Implication:  $S \cap T$  is convex

# Step 4: Feasible solutions to LP

- The set  $U$  of feasible solutions to a Linear Program is convex
- Proof:  $U$  is the intersection of Half Spaces

# Exercise

- Must every convex set be bounded?



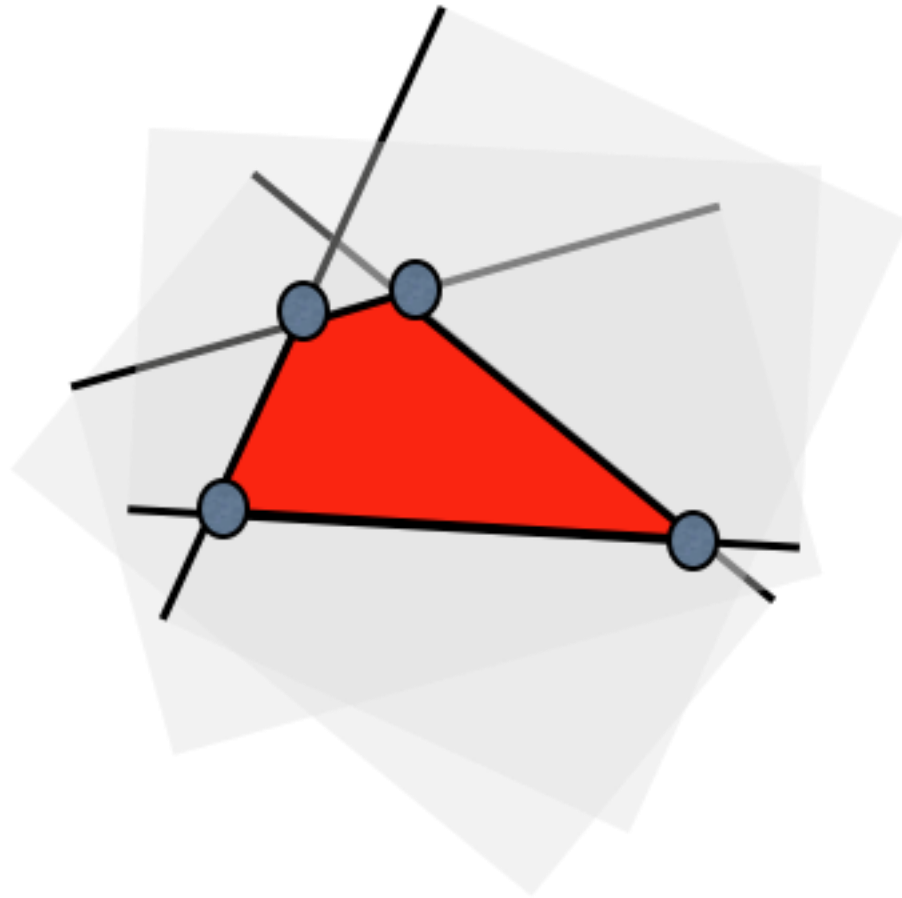
# Step 5: Basic Feasible Solution

- $\mathbf{x}$  is a basic feasible solution to a LP, if

(1)  $\mathbf{x}$  is a feasible solution

(2) There do not exist two other feasible solutions  $\mathbf{y}, \mathbf{z}$  such that  $\mathbf{x} = (\mathbf{y} + \mathbf{z})/2$

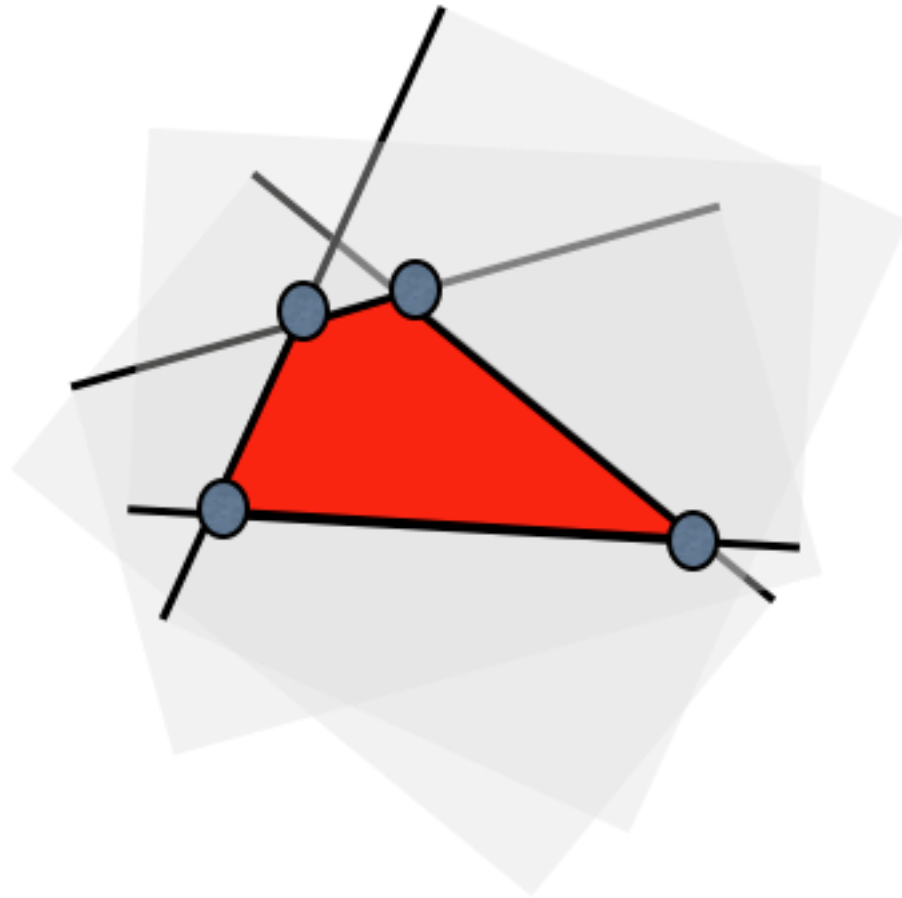
ALSO known as vertex solution, extreme point solution, corner-point solution



# Step 6: BFS and Bounded Polytopes

- If  $U$  is bounded, then any point in  $U$  is the convex combination of its basic feasible solutions

Use  $\mathbf{b}_1, \mathbf{b}_2, \dots, \mathbf{b}_K$  to denote the  $K$  basic feasible solutions



# Step 7: BFS and Optimality for Bounded Polytopes

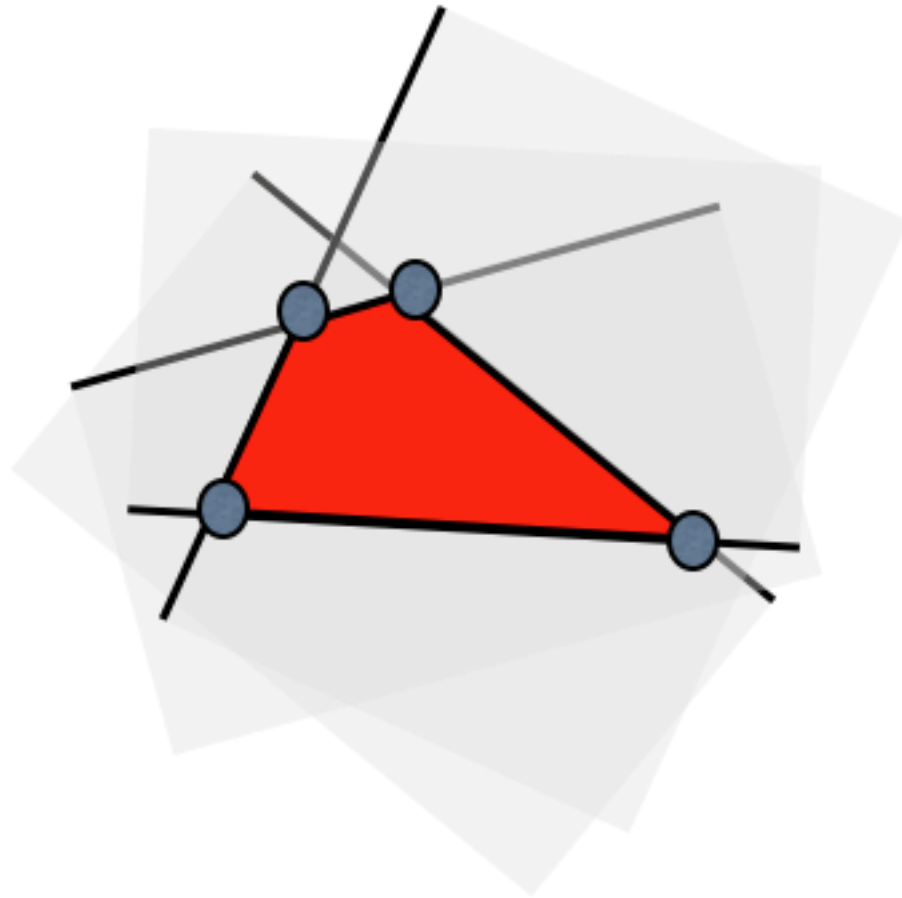
- If  $U$  is bounded and non-empty, then there exists an optimal solution that is also basic feasible

# Step 8: BFS and Optimality for General LPs

- If an LP has a basic feasible solution and an optimum solution, then there exists an optimal solution that is also basic feasible
- Will call these solutions “Vertex Optimal” or “Optimum Basic Feasible”

# Step 9: Two Implications

- (1) SOLUTION OF LPs: The Simplex method which walks from bfs to bfs is correct for bounded polytopes
- (2) STRUCTURAL CONSEQUENCES: The Vertex Optimal Solutions often have very interesting properties. Example: For the matching LP in the next video, every vertex optimal solution is integral





# In Practice

- Most LP Solvers return an optimum basic feasible solution, when one exists.
  - Either, they use Simplex
  - Or, they transform the solution that they do find to a basic feasible solution
- Hence, when we solve a problem using Excel we get an optimum basic feasible solution, when one exists.

## Step 10: A useful property

- At every basic feasible solution, at least  $N$  constraints are tight
- More specifically: Exactly  $N$  Linearly Independent Constraints are tight
- Basic solution: Not necessarily feasible, but exactly  $N$  Linearly Independent Constraints are tight

# Exercise

Is it possible for a LP to have an optimum solution but no basic feasible solution?

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# Exercise

You are given a LP with three decision variables where some of the constraints are

$$0 \leq x \leq 1$$

$$0 \leq y \leq 1$$

$$0 \leq z \leq 1$$

Is it possible to add other constraints and an objective function such that the LP has an optimum solution but not an optimum basic feasible solution?

# LP in standard form

Maximize  $\mathbf{c}^T \mathbf{x}$

Subject to:

$$\mathbf{Ax} = \mathbf{b}$$

$$\mathbf{x} \geq 0$$

- N Variables, M constraints, assume that the M constraints are Linearly Independent
- At any BFS, at most M variables are strictly positive

# Recap

- A feasible solution is basic feasible if it is not the average of two other feasible solutions
- If the feasibility region  $U$  for a LP is bounded and non-empty, then there exists an optimal solution that is also basic feasible
- If an LP has a basic feasible solution and an optimum solution, then there exists an optimal solution that is also basic feasible
- Commercial LP solvers return an optimum basic feasible solution by default, where one exists
- If there are  $N$  decision variables, then a basic feasible solution has  $N$  linearly independent constraints tight