

LINEAR PROGRAMMING

David Kauchak
CS 140 – Spring 2023

1

Admin

Assignment 11 (last one)

LCs

Monday: review

Wednesday: No class - office hours

2

Final logistics

Available on Monday via Gradescope

Graduating seniors: must take by Thursday (4/4) at noon

Everyone else: must take by end of day on Wednesday (4/10)

Open notes, book, assignments

3 hours to take the exam

Review slides posted for Monday which includes overview of topics

3

Linear programming

A linear function is a function of n variables defined by

$$f(x_1, x_2, \dots, x_n) = c_1x_1 + c_2x_2 + \dots + c_nx_n$$

A linear equality is a linear function with an equality constraint

$$f(x_1, x_2, \dots, x_n) = a_1x_1 + a_2x_2 + \dots + a_nx_n = b$$

A linear inequality is a linear function with an inequality constraint

$$f(x_1, x_2, \dots, x_n) = a_1x_1 + a_2x_2 + \dots + a_nx_n \leq b$$

$$f(x_1, x_2, \dots, x_n) = a_1x_1 + a_2x_2 + \dots + a_nx_n \geq b$$

4

Linear programming

A linear programming problem consists of two parts

1. a linear function to maximize or minimize

$$\text{maximize } c_1x_1 + c_2x_2 + \dots + c_nx_n$$

2. subject to a set of linear constraints

$$a_{11}x_1 + a_{12}x_2 + \dots + a_{1n}x_n = b$$

$$a_{21}x_1 + a_{22}x_2 + \dots + a_{2n}x_n \leq b$$

...

$$a_{m1}x_1 + a_{m2}x_2 + \dots + a_{mn}x_n \geq b$$

5

For example

$$\text{maximize } x_1 + x_2$$

objective function

subject to

$$4x_1 - x_2 \leq 8$$

$$2x_1 + x_2 \leq 10$$

$$5x_1 - 2x_2 \geq -2$$

$$x_1, x_2 \geq 0$$

constraints

6

For example

$$\text{maximize } x_1 + x_2$$

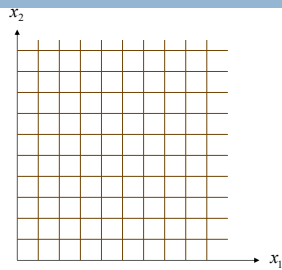
subject to

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$$2x_1 + x_2 \leq 10$$

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7

For example

$$\text{maximize } x_1 + x_2$$

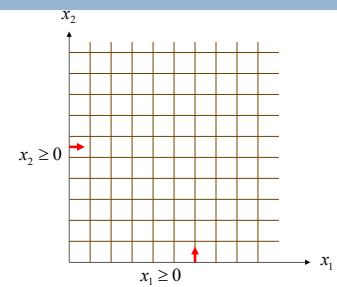
subject to

$$4x_1 - x_2 \leq 8$$

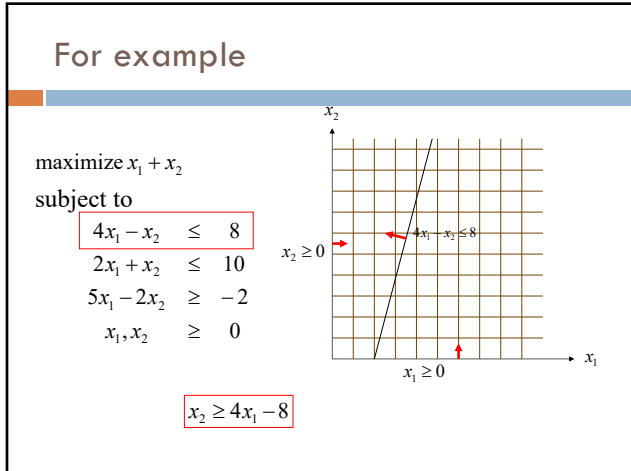
$$2x_1 + x_2 \leq 10$$

$$5x_1 - 2x_2 \geq -2$$

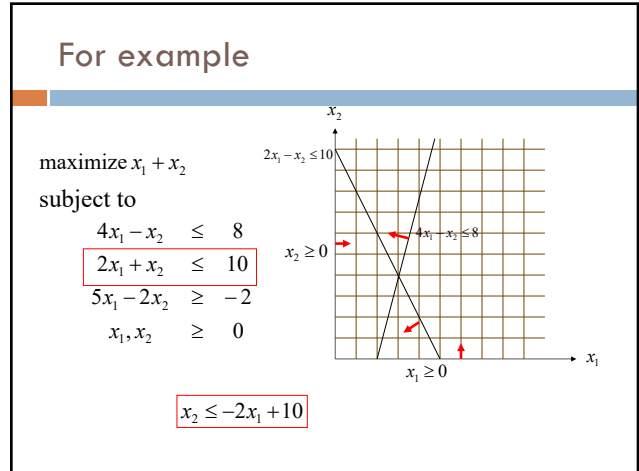
$$x_1, x_2 \geq 0$$



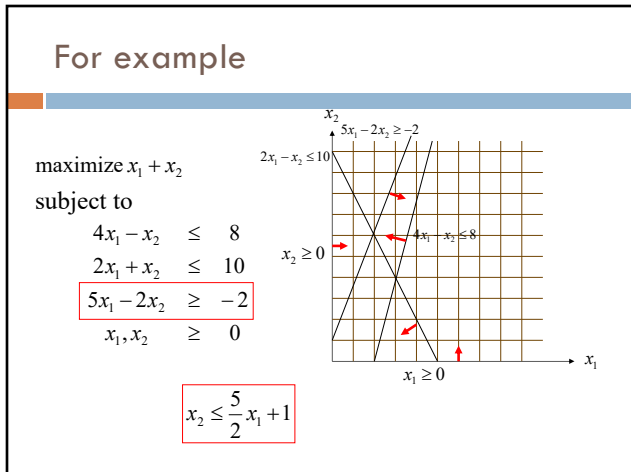
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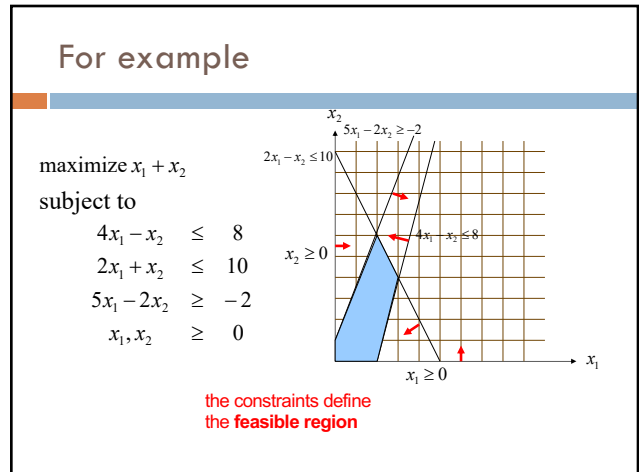
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10



11



12

For example

maximize $x_1 + x_2$

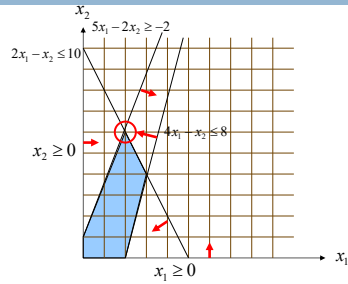
subject to

$$4x_1 - x_2 \leq 8$$

$$2x_1 + x_2 \leq 10$$

$$5x_1 - 2x_2 \geq -2$$

$$x_1, x_2 \geq 0$$



What are the values of x_i that maximize the function within the feasible region?

13

Another example

A chocolatier has two products: a basic product and a deluxe. The company makes x_1 boxes of the basic per day at a profit of \$1 each and x_2 boxes of the deluxe at a profit of \$6 each. The daily demand is 200 of the basic and 300 of the deluxe. The workforce can create 400 boxes of chocolate per day. How much of each should they create to maximize profits?

14

Another example

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How many variables do we need to model the problem?

15

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x_1 = number of boxes per day of basic

x_2 = number of boxes per day of deluxe

16

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What are the constraints?

17

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$$x_1 \leq 200$$

$$x_2 \leq 300$$

18

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$$x_1 \leq 200$$

$$x_2 \leq 300$$

$$x_1 + x_2 \leq 400$$

any others?

19

Another example

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$$x_1 \leq 200$$

$$x_2 \leq 300$$

$$x_1 + x_2 \leq 400$$

$$x_1, x_2 \geq 0$$

What function are we trying to maximize/minimize?

20

Another example

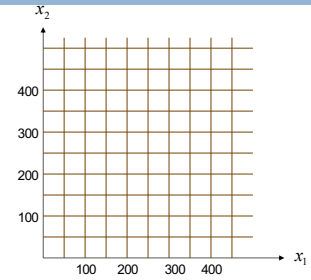
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$$\begin{aligned} &\text{maximize } x_1 + 6x_2 \\ &\text{subject to} \\ &\quad x_1 \leq 200 \\ &\quad x_2 \leq 300 \\ &\quad x_1 + x_2 \leq 400 \\ &\quad x_1, x_2 \geq 0 \end{aligned}$$

21

Another example

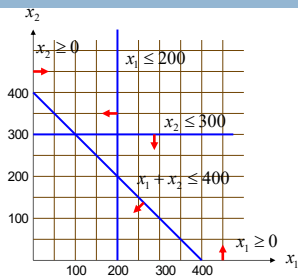
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22

Another example

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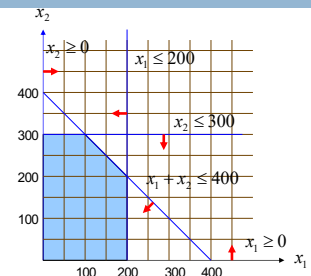


Where is the feasibility region?

23

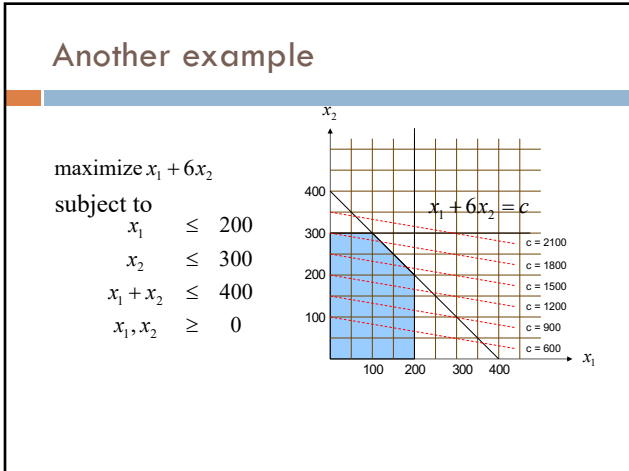
Another example

$$\begin{aligned} &\text{maximize } x_1 + 6x_2 \\ &\text{subject to} \\ &\quad x_1 \leq 200 \\ &\quad x_2 \leq 300 \\ &\quad x_1 + x_2 \leq 400 \\ &\quad x_1, x_2 \geq 0 \end{aligned}$$

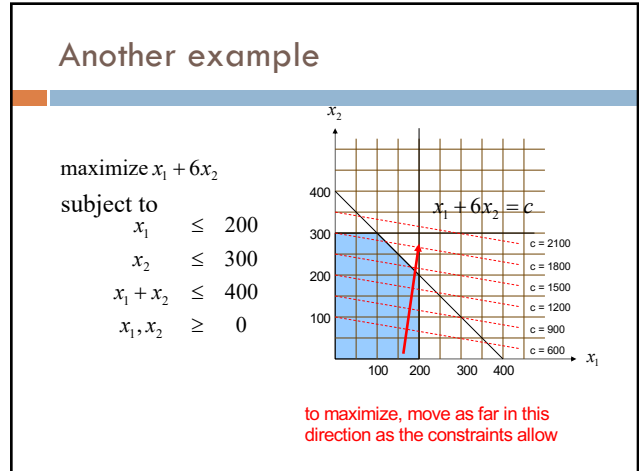


Where is the maximum within the feasibility region?

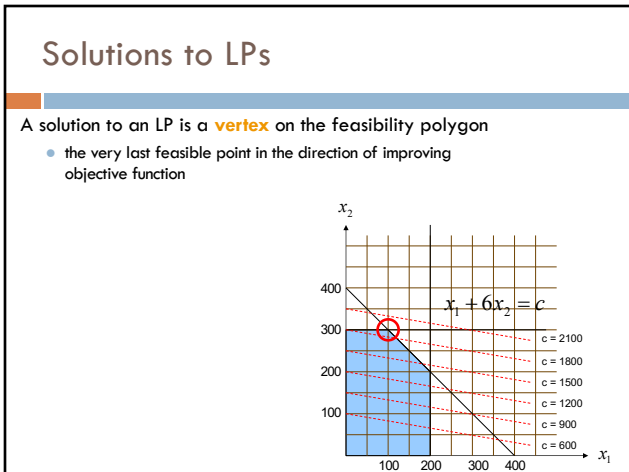
24



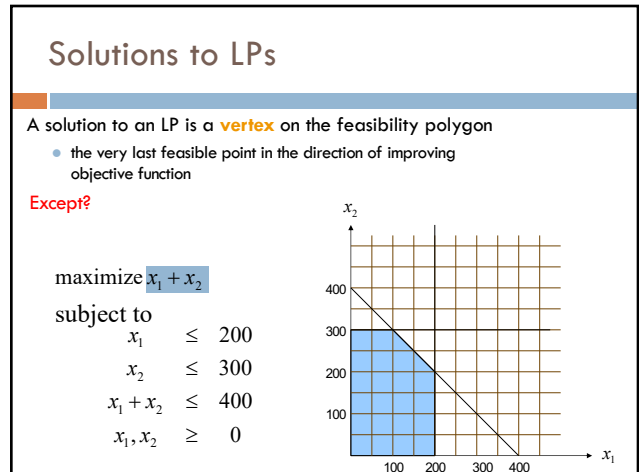
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26



27



28

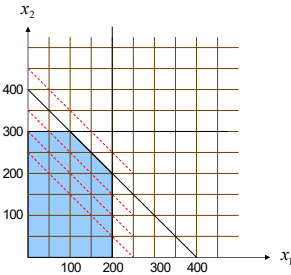
Solutions to LPs

A solution to an LP is a **vertex** on the feasibility polygon

- the very last feasible point in the direction of improving objective function

Except?

$$\begin{aligned} &\text{maximize } x_1 + x_2 \\ &\text{subject to} \\ &\quad x_1 \leq 200 \\ &\quad x_2 \leq 300 \\ &\quad x_1 + x_2 \leq 400 \\ &\quad x_1, x_2 \geq 0 \end{aligned}$$



29

Solutions to LPs

A solution to an LP is a **vertex** on the feasibility polygon

- the very last feasible point in the direction of improving objective function

Except?

$$\begin{aligned} &\text{maximize } x_1 + 6x_2 \\ &\text{subject to} \\ &\quad x_1 \leq 1 \\ &\quad x_1 \geq 2 \\ &\quad \dots \end{aligned}$$

linear program is **infeasible**

30

Solutions to LPs

A solution to an LP is a **vertex** on the feasibility polygon

- the very last feasible point in the direction of improving objective function

Except?

$$\begin{aligned} &\text{maximize } x_1 + x_2 \\ &\text{subject to} \\ &\quad x_1, x_2 \geq 0 \end{aligned}$$

linear program is **unbounded**

31

More products

The chocolatier decides to introduce a third product line called premium with a profit of \$13. We still can only produce 400 units per day. The deluxe and premium products require the same packaging machinery. Deluxe uses one unit and premium uses 3 units. We have a total of 600 units a day of this packaging material.

$$\begin{aligned} &\text{maximize } x_1 + 6x_2 \\ &\text{subject to} \\ &\quad x_1 \leq 200 \\ &\quad x_2 \leq 300 \\ &\quad x_1 + x_2 \leq 400 \\ &\quad x_1, x_2 \geq 0 \end{aligned}$$

what changes?

32

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Introduce a new variable x_3

$$\text{maximize } x_1 + 6x_2$$

subject to

$$x_1 \leq 200$$

$$x_2 \leq 300$$

$$x_1 + x_2 \leq 400$$

$$x_1, x_2, x_3 \geq 0$$

33

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Introduce a new constraint

$$\text{maximize } x_1 + 6x_2$$

subject to

$$x_1 \leq 200$$

$$x_2 \leq 300$$

$$x_1 + x_2 \leq 400$$

$$x_1, x_2, x_3 \geq 0$$

34

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subject to

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$$x_2 + 3x_3 \leq 600$$

$$x_1, x_2, x_3 \geq 0$$

35

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36

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$$\begin{aligned} &\text{maximize } x_1 + 6x_2 && \text{modify existing constraints} \\ &\text{subject to} \\ & \quad x_1 \leq 200 \\ & \quad x_2 \leq 300 \\ & \quad x_1 + x_2 + x_3 \leq 400 \\ & \quad x_2 + 3x_3 \leq 600 \\ & \quad x_1, x_2, x_3 \geq 0 \end{aligned}$$

37

More products

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$$\begin{aligned} &\text{maximize } x_1 + 6x_2 && \text{Anything else?} \\ &\text{subject to} \\ & \quad x_1 \leq 200 \\ & \quad x_2 \leq 300 \\ & \quad x_1 + x_2 + x_3 \leq 400 \\ & \quad x_2 + 3x_3 \leq 600 \\ & \quad x_1, x_2, x_3 \geq 0 \end{aligned}$$

38

More products

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$$\begin{aligned} &\text{maximize } x_1 + 6x_2 + 13x_3 && \text{modify the objective function} \\ &\text{subject to} \\ & \quad x_1 \leq 200 \\ & \quad x_2 \leq 300 \\ & \quad x_1 + x_2 + x_3 \leq 400 \\ & \quad x_2 + 3x_3 \leq 600 \\ & \quad x_1, x_2, x_3 \geq 0 \end{aligned}$$

39

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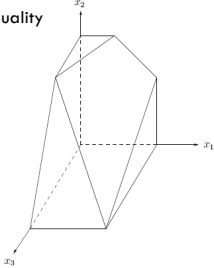
$$\begin{aligned} &\text{maximize } x_1 + 6x_2 + 13x_3 \\ &\text{subject to} && \text{What does the feasibility} \\ & \quad x_1 \leq 200 && \text{region look like?} \\ & \quad x_2 \leq 300 \\ & \quad x_1 + x_2 + x_3 \leq 400 \\ & \quad x_2 + 3x_3 \leq 600 \\ & \quad x_1, x_2, x_3 \geq 0 \end{aligned}$$

40

Feasibility region

For n variables, the feasibility region is a polyhedron in \mathbb{R}^n (i.e. n -dimensional space)

Each constraint defines a \mathbb{R}^{n-1} plane and the inequality a half-space on one side of the plane

$$\begin{aligned} &\text{maximize } x_1 + 6x_2 + 13x_3 \\ &\text{subject to} \\ &\quad x_1 \leq 200 \\ &\quad x_2 \leq 300 \\ &\quad x_1 + x_2 + x_3 \leq 400 \\ &\quad x_2 + 3x_3 \leq 600 \\ &\quad x_1, x_2, x_3 \geq 0 \end{aligned}$$


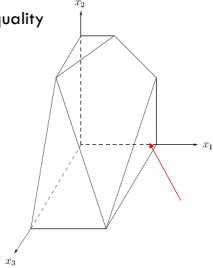
adapted from figure 7.2 of [1]

41

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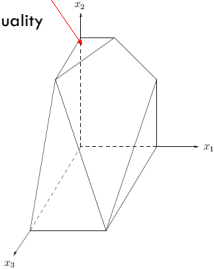
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42

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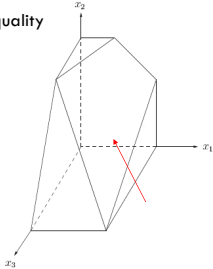
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43

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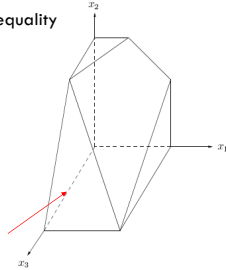
44

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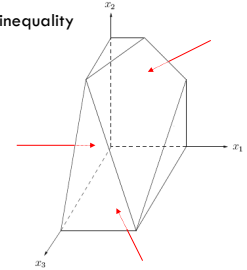
45

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adapted from figure 7.2 of [1]

46

Solving linear programs

If a solution exists, a vertex of the feasibility space is an optimal solution

Because the objective function is linear, we can use a *hill-climbing* or greedy approach by starting at one vertex and moving to an adjacent vertex that improves the object function

When we're on top of the "hill", i.e. we cannot move to a better neighboring vertex, we're done

The **simplex** method does exactly this

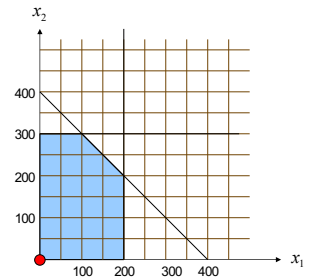
55

Simplex method

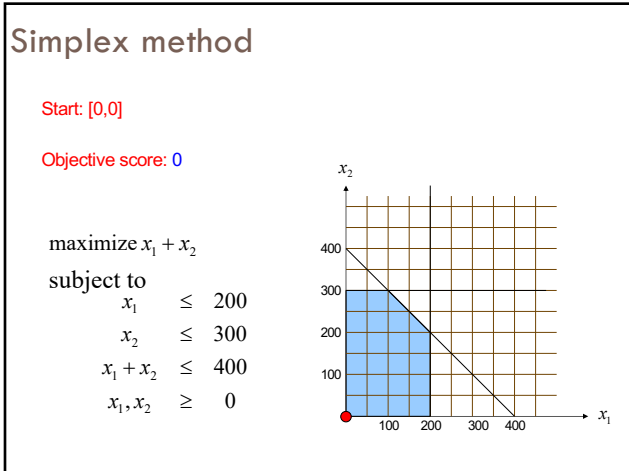
Start: $[0,0]$

Objective score:

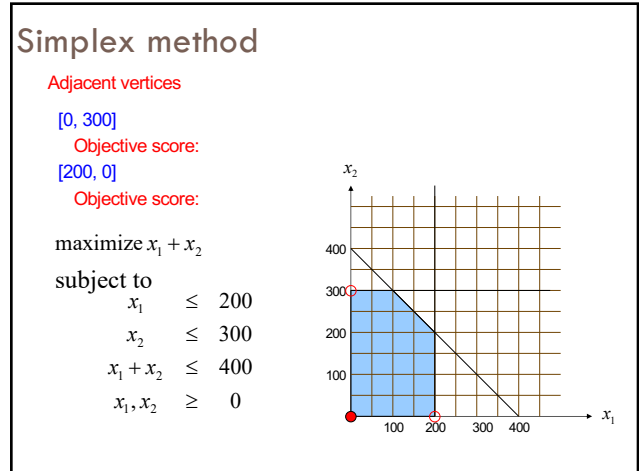
$$\begin{aligned} &\text{maximize } x_1 + x_2 \\ &\text{subject to} \\ &\quad x_1 \leq 200 \\ &\quad x_2 \leq 300 \\ &\quad x_1 + x_2 \leq 400 \\ &\quad x_1, x_2 \geq 0 \end{aligned}$$



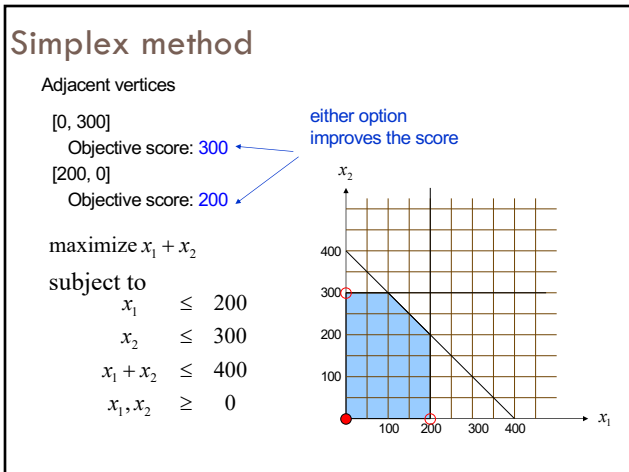
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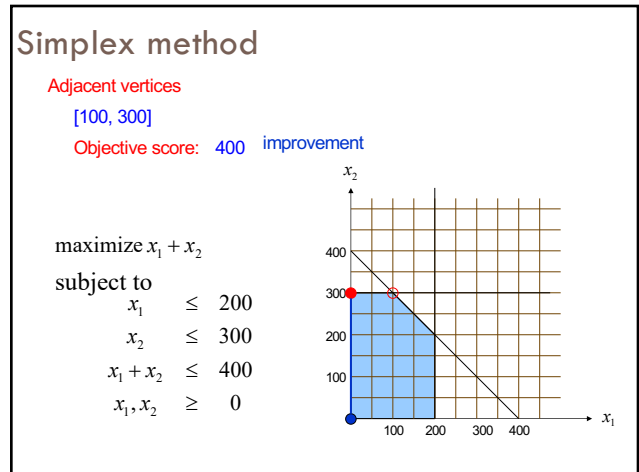
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58



59



60

Simplex method

Adjacent vertices
 [200, 200]
 Objective score: 400

No improvement, so we're done

maximize $x_1 + x_2$
 subject to
 $x_1 \leq 200$
 $x_2 \leq 300$
 $x_1 + x_2 \leq 400$
 $x_1, x_2 \geq 0$

61

Another simplex example

Start at [0,0,0]
 Adjacent vertices

maximize $x_1 + 6x_2 + 13x_3$
 subject to
 $x_1 \leq 200$
 $x_2 \leq 300$
 $x_1 + x_2 + x_3 \leq 400$
 $x_2 + 3x_3 \leq 600$
 $x_1, x_2, x_3 \geq 0$

62

Another simplex example

Start at [0,0,0]
 Adjacent vertices

maximize $x_1 + 6x_2 + 13x_3$
 subject to
 $x_1 \leq 200$
 $x_2 \leq 300$
 $x_1 + x_2 + x_3 \leq 400$
 $x_2 + 3x_3 \leq 600$
 $x_1, x_2, x_3 \geq 0$

63

Another simplex example

[200,0,0]
 Adjacent vertices

maximize $x_1 + 6x_2 + 13x_3$
 subject to
 $x_1 \leq 200$
 $x_2 \leq 300$
 $x_1 + x_2 + x_3 \leq 400$
 $x_2 + 3x_3 \leq 600$
 $x_1, x_2, x_3 \geq 0$

64

Another simplex example

[200,200,0]
Adjacent vertices

maximize $x_1 + 6x_2 + 13x_3$
subject to

$$\begin{aligned} x_1 &\leq 200 \\ x_2 &\leq 300 \\ x_1 + x_2 + x_3 &\leq 400 \\ x_2 + 3x_3 &\leq 600 \\ x_1, x_2, x_3 &\geq 0 \end{aligned}$$

65

Another simplex example

[200,0,200]
Adjacent vertices

maximize $x_1 + 6x_2 + 13x_3$
subject to

$$\begin{aligned} x_1 &\leq 200 \\ x_2 &\leq 300 \\ x_1 + x_2 + x_3 &\leq 400 \\ x_2 + 3x_3 &\leq 600 \\ x_1, x_2, x_3 &\geq 0 \end{aligned}$$

66

Another simplex example

[0,300,100]
Adjacent vertices

All others are lower,
optimum found

maximize $x_1 + 6x_2 + 13x_3$
subject to

$$\begin{aligned} x_1 &\leq 200 \\ x_2 &\leq 300 \\ x_1 + x_2 + x_3 &\leq 400 \\ x_2 + 3x_3 &\leq 600 \\ x_1, x_2, x_3 &\geq 0 \end{aligned}$$

67

Running time of simplex

Worst case is exponential

There are theoretical examples that can be created where the running time is exponential

In practice, the algorithm is much faster

68

Other LP solvers

Many other LP algorithms exist

- ellipsoid algorithm
- interior point methods (many of these)

Both of the above algorithms are
 $O(\text{polynomial time})$

State of the art run-times are a toss up between interior point methods and simplex solvers

69

Another example

Carpet company: From our analysts, we're given carpet demand estimates for the next calendar year: d_1, d_2, \dots, d_n . The company has 30 employees, each of which makes 20 carpets per month and gets paid \$2000/mo.

The demand fluctuates from month to month. We can handle this demand in three ways:

- Overtime: Overtime costs 80% more than regular pay. Workers can put in at most 30% overtime
- Hiring and firing, at a cost of \$320 and \$400 respectively per worker
- Store extra carpets at a cost of \$8 per carpet per month. We must end the year without any stored carpets.

70

Uses

- operational problems
- network flow
- planning
- microeconomics

71

References

- [1] Algorithms (2008). Sanjoy Dasgupta, Christos Papadimitiou and Umesh Vazirani.

72