

# Optimization

- finding critical pts, etc
- Lagrange multipliers
- Linear programming
- Gradient descent (Newton's method)

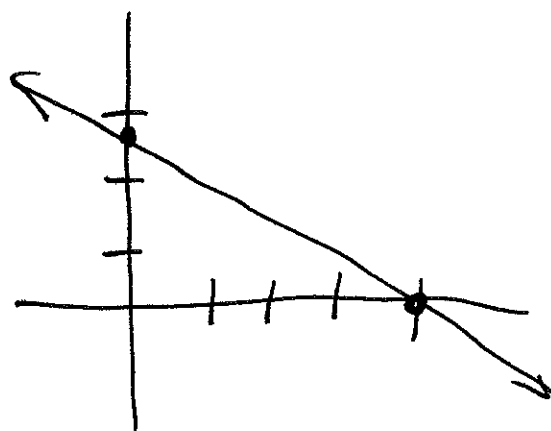
Maximize/minimize  $f(x, y)$

subject to  $g(x, y) = c$ .

|| occurs where  
 $\nabla f = \lambda \nabla g$ .

Ex Find the point on  $2x + 3y = 8$   
closest to  $(0, 0)$ .

$$g(x, y) = 2x + 3y = 8$$



What want to minimize!

$$\sqrt{x^2 + y^2}$$

use  $f(x, y) = x^2 + y^2$  instead.

$$\nabla f = \lambda \nabla g$$

$$\langle 2x, 2y \rangle = \lambda \langle 2, 3 \rangle$$

3 eqns, 3 variables.

$$2x = 2\lambda$$

$$2y = 3\lambda$$

$$2x + 3y = 8$$

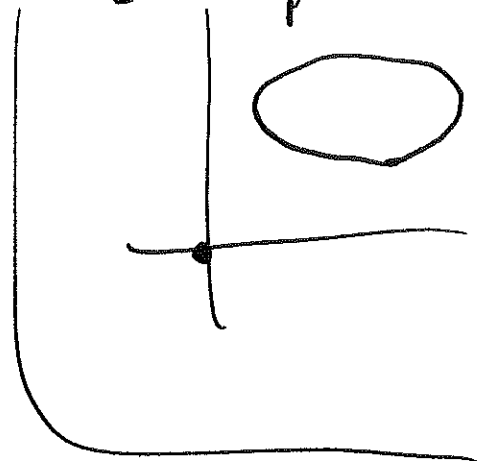
$$\hookrightarrow 3y = \frac{9}{2}\lambda$$

$$2x + 3y = \frac{13}{2}\lambda = 8$$

$$\lambda = \frac{16}{13}$$

$$\boxed{x = \frac{16}{13}, y = \frac{24}{13}}$$

can solve  
similar problems!



# Linear programming

## 3 variable problem

3 foods available: \*

	cost	VitA	Calories
Corn	18¢	107	72
milk	23¢	500	121
bread	5¢	0	65

Requirements: Budget: ~~1\$~~

Vit A: 5000-50000

Calories: 2000-2250

Minimize Budget while satisfying both requirements.

---

With two variables, we can draw a plot!

With  $\geq 3$ , better to use an algorithm: the Simplex  
method

Use variables  $c, m, b$ .

$$107c + 500m + 0b \leq 50000 \quad c, m, b \geq 0$$

$$107c + 500m + 0b \geq 5000$$

$$72c + 121m + 65b \geq 2000$$

$$72c + 121m + 65b \leq 2250.$$

objective function:

minimize  $18c + 23^m b + 5b$

maximize:  $-18c - 23m - 5b$

Simplex Method

(we solved it on the computer)

# Knapsack problem

Suppose you're packing your backpack.

You have list of possible items, each with a weight + usefulness score.

	Item	Weight	Useful
$x_1$	Lunch	2	10
$x_2$	Books	10	1
$x_3$	Water	1	6
$x_4$	Computer	5	11
$x_5$	Spare coat	2	2
$x_6$	Pencils	0.5	5

Max weight: 7 lbs

all variables must be binary!

Either 0 or 1.

Simplex alg can handle that

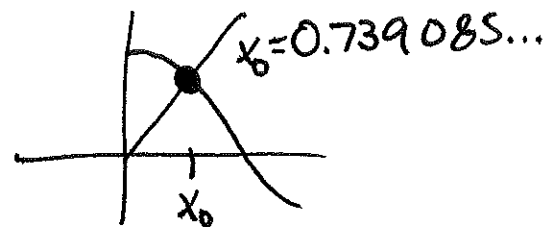
Maximize:  $10x_1 + 1x_2 + 6x_3 + 11x_4 + 2x_5 + 5x_6$

Subject to:  $2x_1 + 10x_2 + 1x_3 + 5x_4 + 2x_5 + 0.5x_6 \leq 7$

# Newton's method (root-finding, not optimization)

Suppose you want to find a root of a function  $f(x)$  but can't solve algebraically.

e.g.  $x - \cos x = 0$

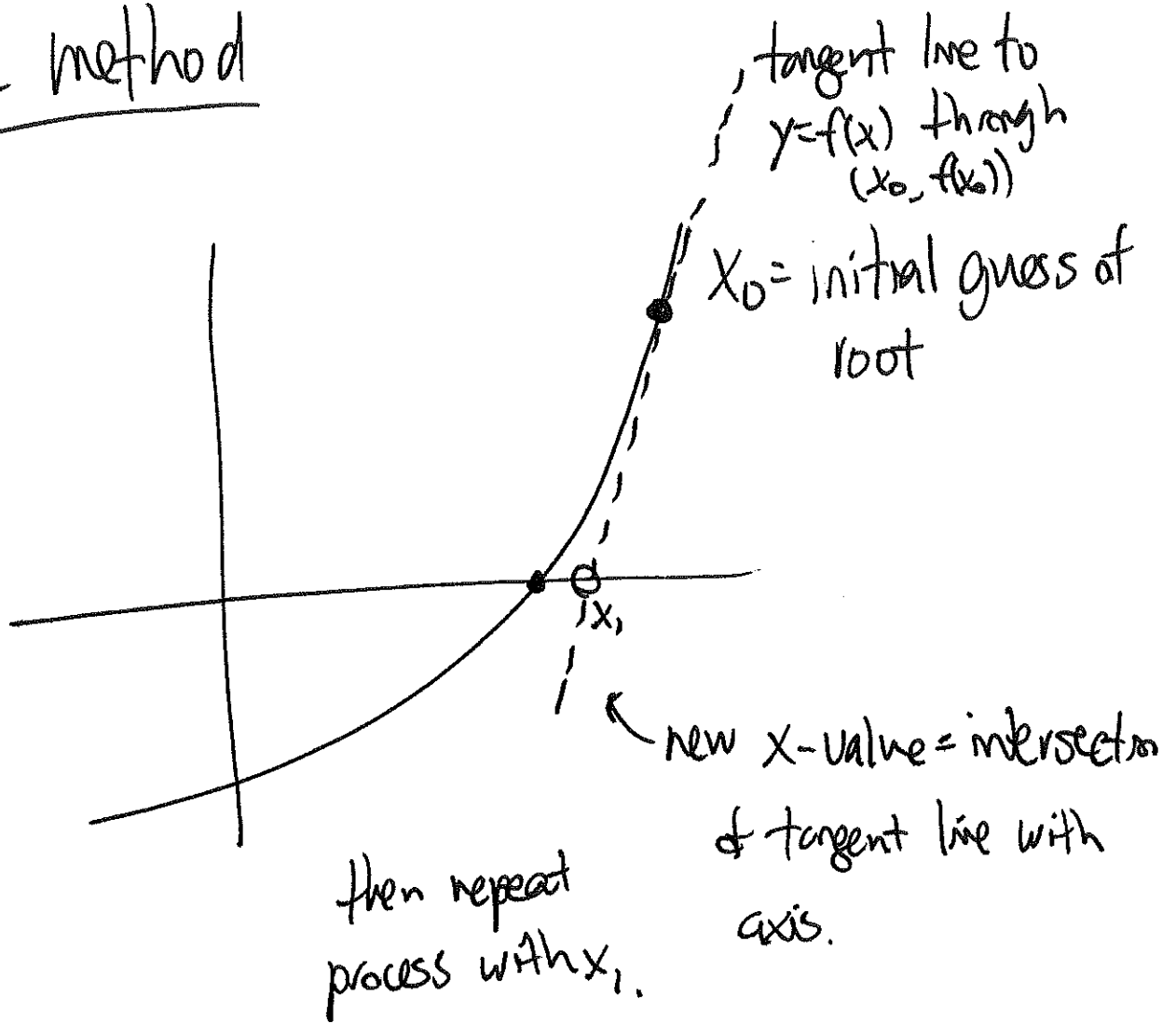


Newton's method lets you find a numerically accurate approximation of the root (many digits)

---

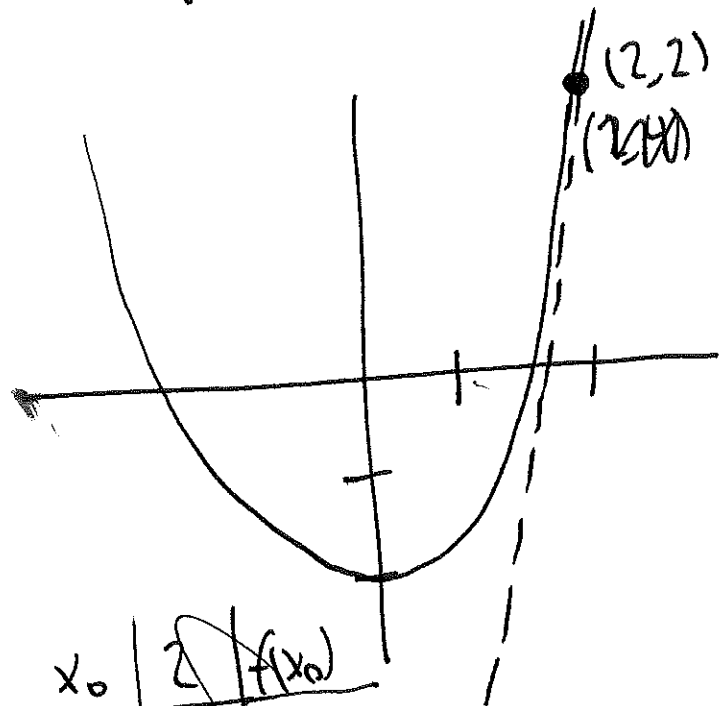
Exer

# The method



# Example

Find a root of,  $x^2 - 2 = 0$



Initial guess:  $x_0 = 2$

Tangent line to  $x^2 - 2$   
at  $x = 2$ ?

~~$y = 2x - 2$~~   $y = 4x - 6$   
 $y = 0$  when  
 $x = 3/2$

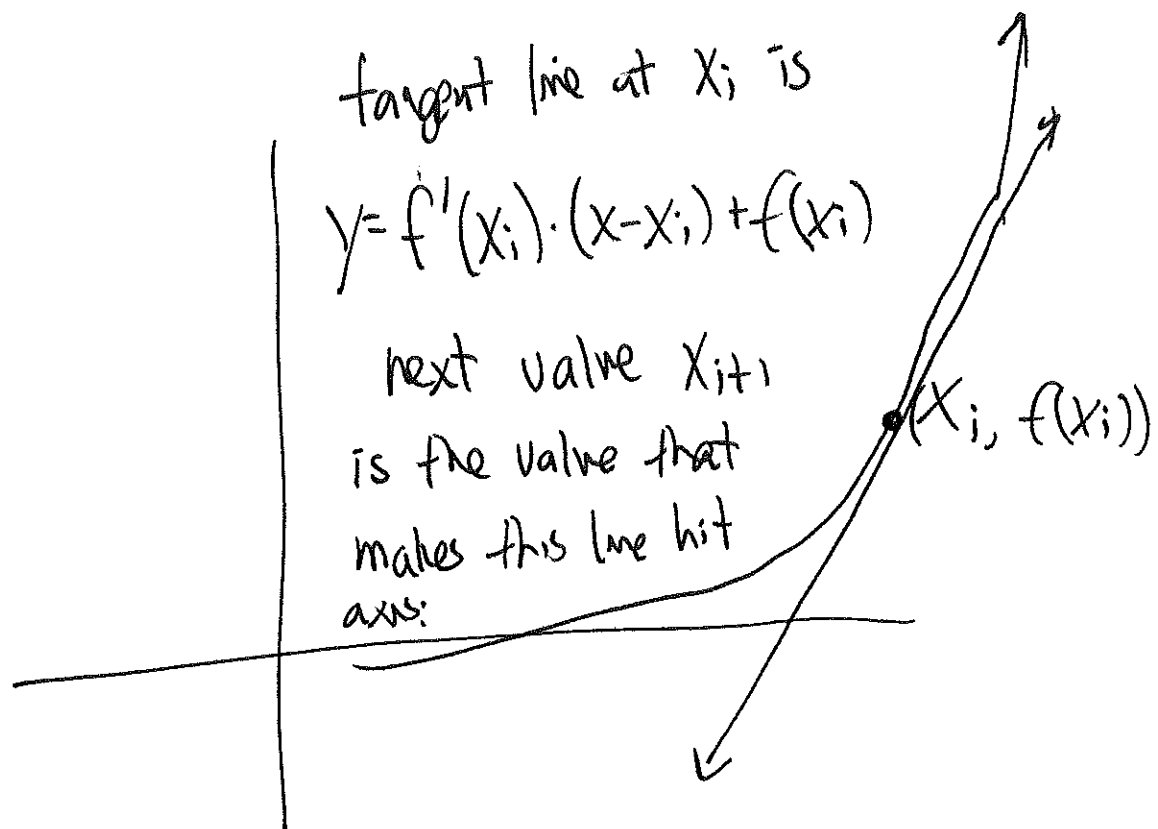
$x_0$	2	$f(x_0)$
$x_1$	$3/2$	

i	$x_i$	$f(x_i)$
0	2	2
1	$3/2$	$1/4$
2	$17/12$	$1/144$

Keep going: ...



## General formula



$$f'(x_i) \cdot (x - x_i) + f(x_i) = 0$$

$$x - x_i = - \frac{f(x_i)}{f'(x_i)}$$

$$x_{i+1} = x_i - \frac{f(x_i)}{f'(x_i)}$$

## Newton examples

$$f(x) = x^2 - 2 \leadsto \text{approximations of } \sqrt{2}$$

$$\begin{array}{l} 2, 3/2, 17/12, 577/408, 665857/470832 \\ \text{or } 1, \nearrow \quad 1/2, 9/4, 113/72, 23137/16212, \dots \end{array}$$

$$f(x) = x - \cos x$$

$$1.000, 0.75036, 0.73911,$$

$$0.7390851333, 0.739085133215161, \dots$$

Doubles the number of correct digits every iterations!

---

$$f(x) = \sin x \leadsto \text{approximate } \pi$$

$$3, 3.142546\dots, 3.14159265330048,\dots$$

$$3.14159265358979,\dots$$