

Plan:

- ① Optimization without constraints
- ② Extreme value theorem
- ③ Constrained optimization

① Unconstrained optimization

max/min $f(x,y)$

- no extra
conditions
on (x,y)
= Unconstrained

Method:

① Find all candidate pts

i) Stationary pts: $f'_x = f'_y = 0$

FOC

ii) Pts where f'_x or f'_y
are not defined

(critical pts)

iii) Boundary pts of D_f .

Ex:

max $x^2 + y^2$

when $x, y = 1$

Constrained

② Classify stationary pts

local max
local min
saddle pts

Second derivative test:

(x^*, y^*) stationary pt

$$H(f)(x^*, y^*) = \begin{pmatrix} A & B \\ B & C \end{pmatrix} \quad \begin{aligned} \det &= AC - B^2 \\ \text{tr} &= A + C \end{aligned}$$

$AC - B^2 > 0, A + C > 0 \Rightarrow (x^*, y^*)$ local min
" " local max
" " saddle pt.
 $AC - B^2 < 0$

Problems:

- i) Stationary pt with $AC - B^2 = 0$
 - ii) Candidate pts that are not stationary pts
- } use other methods (detn.)

③ Determine if local max/min are global max/min

global max \Rightarrow local max
global min \Rightarrow local min

Examples:

One variable



Two variables



local and global min



local max but not max

global mins

How to determine:

Ex: $f(x,y) = x^3 - 3xy + y^3$

Cand. pts:

(0,0) saddle pt.
(1,1) local min

No global max (no local max)

$f(0,0) = 0$ $f(1,1) = -1$

Global min: $f(1,1) = -1$ is a candidate

(the only candidate)

Try $y=0$: $f(x,0) = x^3$
 $f(-2,0) = (-2)^3 = -8 < -1$

no global min

② Constrained optimization

\max/\min $f(x,y)$ where $\left\{ \begin{array}{l} g(x,y) = a \\ \text{or} \\ g(x,y) \leq a \\ \text{or} \\ \text{similar} \end{array} \right.$
Objective function
constraints

$D =$ the set of all points (x,y) that satisfy all constraints
admissible points

Ex: $\min f(x,y) = x^2 + y^2$ where $2x + 3y \leq 6$
 $x = 12/13$ is the min. pt.
 $f_{\min} = \frac{13}{9} \cdot \left(\frac{12}{13}\right)^2 - \frac{8}{3} \cdot \left(\frac{12}{13}\right) + 4 = \frac{36}{13}$
 admissible pts = a line (red line)
 $3y = 6 - 2x$
 $y = 2 - \frac{2}{3}x$
 $f(x, 2 - \frac{2}{3}x) = x^2 + (2 - \frac{2}{3}x)^2$
 $= x^2 + 4 - \frac{8}{3}x + \frac{4}{9}x^2 = \frac{13}{9}x^2 - \frac{8}{3}x + 4$
 $l' = \frac{26}{9}x - \frac{8}{3} = 0 \quad \cdot 9 \quad 26x - 24 = 0 \quad x = \frac{24}{26} = \frac{12}{13}$

First method: If the constraint is an equation that is easy to solve, you can solve it for x or y , and substitute it into the obj. $f(x,y)$, and solve as an unconstrained problem in one variable.

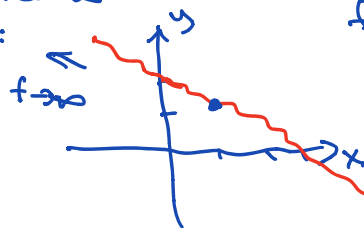
Extreme Value Thm: (EVT)

If f is a continuous function on a compact subset D of \mathbb{R}^2 (xy-plane), then f has a max and a min.

Use: $f = f(x,y)$ objective function

$D =$ the set of admissible pts
 $=$ the set of all pts satisfying the constraints

In the previous example:



$$f(x,y) = x^2 + y^2$$

cont. ✓



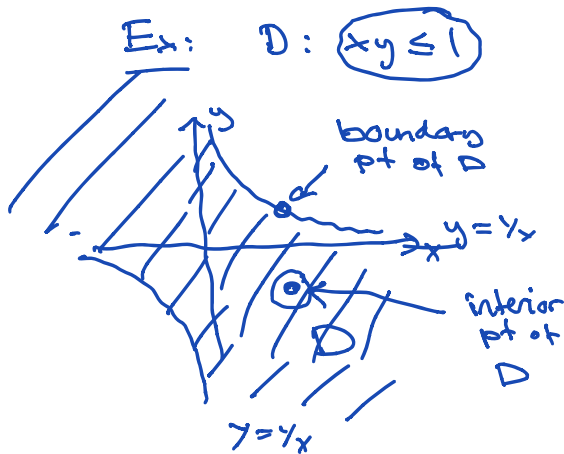
$f \rightarrow \infty$

Defn: A set D is compact if it is closed and bounded.

i) Closed sets:

If the constraints are given by = (eqn.) or \leq, \geq (closed inequalities) then the set D of adm. pts is closed.

Ex: $2x + 3y = 6$ is closed



$\leftarrow D$ is closed (\leq)

$xy = 1$: $y = 1/x$ hyperbola
these pts are called boundary pts

$xy < 1$:

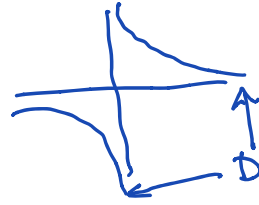
$$y < 1/x \quad (x > 0)$$

$$y > 1/x \quad (x < 0)$$

these pts are called interior pts of D

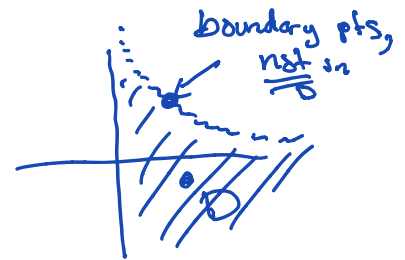
Closed sets = all boundary pts of D are included in D

Ex: $D: y = 1/x$
closed



D has only boundary pts (no interior pts)

$D: xy < 1, x > 0$
 $x > 0, y < 1/x$
not closed



D : only interior pts

ii) Bounded



D is bounded if there are finite numbers a, b, c, d such that

$$a \leq x \leq b$$

$$c \leq y \leq d$$

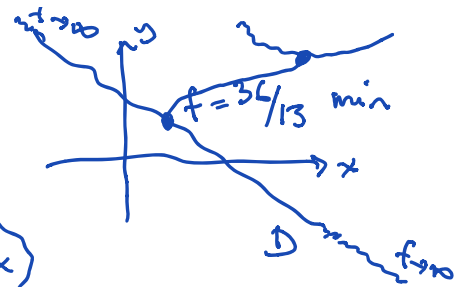
for all pts (x, y) in D .

Ex: $D: 2x + 3y = 6$

closed, not bounded

\Rightarrow not compact

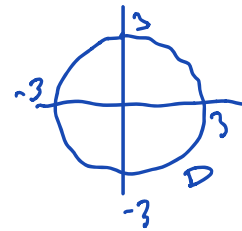
min
not max



$D: x^2 + y^2 = 9$

closed, bounded \Rightarrow compact

$$\begin{pmatrix} -3 \leq x \leq 3 \\ -3 \leq y \leq 3 \end{pmatrix}$$



$D: x^2 + y^2 < 9$

not closed, bounded

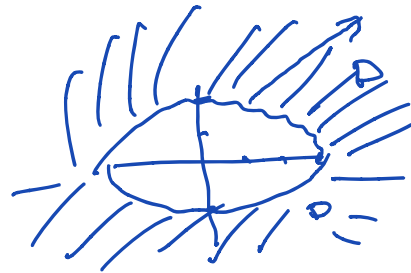
not compact



$D: 4x^2 + 9y^2 \geq 36$

closed, not bounded

not compact.



$4x^2 + 9y^2 = 36 \quad | :36$

$\frac{x^2}{9} + \frac{y^2}{4} = 1$

How do you find candidate pts for a problem with constraints?

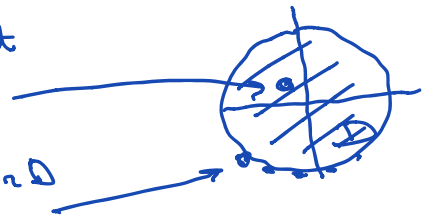
A) Solve the inequality for x or y , and substitute in $f(x,y)$

\Rightarrow optimization problem in one variable without constraints

B) Consider all possible candidate pts

- all interior pts that are stationary

- all boundary pts in D



I will do an example below.

C) Lagrange's method. (next lecture)

An example of method B

max/min $f(x,y) = e^{xy}$ when $-1 \leq x,y \leq 1$

Candidate pts:

a) Stationary pts of f
that are interior
pts in D :

$$f'_x = e^{xy} \cdot y = 0$$

$$f'_y = e^{xy} \cdot x = 0$$

$$\Leftrightarrow y=0, x=0 \Rightarrow (x,y) = \underline{(0,0)}$$

interior pt \checkmark

$$\Leftrightarrow \underline{(x,y) = (0,0)} \quad \underline{f(0,0) = 1}$$

b) All boundary pts:

A: $x=1, -1 \leq y \leq 1$

$$f(1,y) = e^y$$

increasing function
 $(e^y)' = e^y > 0$

B: $y=1, -1 \leq x \leq 1$

$$f(x,1) = e^x$$

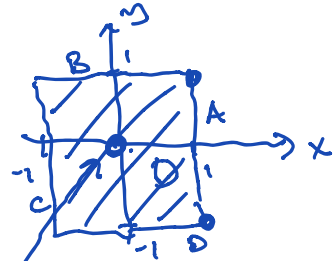
Smallest value: on A

$$f(1,-1) = e^{-1} = \frac{1}{e} \approx 0.37$$

Biggest value: on B

$$f(1,1) = e^1 = e \approx 2.72$$

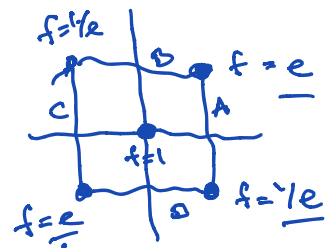
\rightarrow same biggest/smallest
value by symmetry



D is closed
and bounded

\Downarrow
 D compact

\Downarrow
there is a
max and a min



C: $x = -1, -1 \leq y \leq 1$
 $f(-1, y) = e^{-y}$
 $(e^{-y})' = -e^{-y} < 0$
decreasing.

D: Same as C,
by symmetry

Biggest value on C

$$f(-1, -1) = e \approx \underline{2.72}$$

Smallest value on C

$$f(-1, 1) = \frac{1}{e} \approx 0.37$$

$$f_{\max} = e \approx \underline{2.72} \quad \text{at} \quad (x, y) = (1, 1), (-1, -1)$$

$$f_{\min} = \frac{1}{e} \approx \underline{0.37} \quad \text{at} \quad (x, y) = (1, -1), (-1, 1)$$