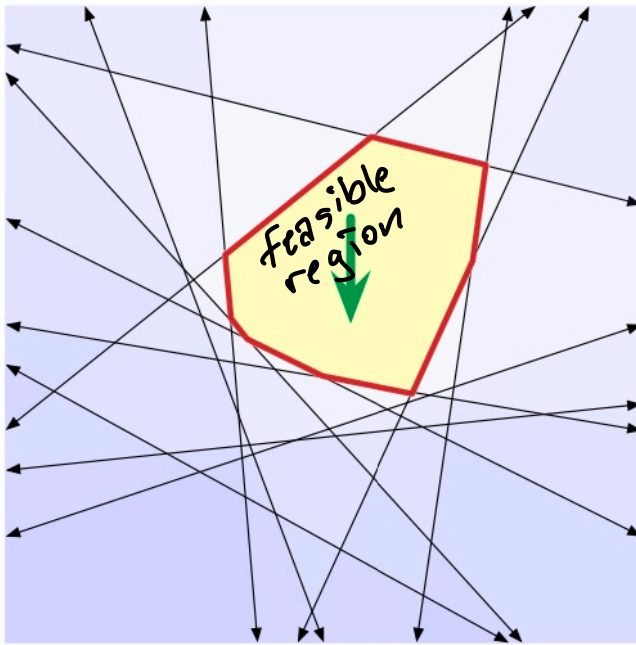


Linear programming — Find lowest point in a convex polyhedron



2 vars
n+2 constraints

Dual
n variables
n+2 constraints

Primal (P)

$$\begin{aligned} \max \quad & c \cdot x \\ \text{s.t.} \quad & Ax \leq b \\ & x \geq 0 \end{aligned}$$

d variables
n matrix constraints
d sign constraints

Dual (D)

$$\begin{aligned} \min \quad & y \cdot b \\ \text{s.t.} \quad & yA \geq c \\ & y \geq 0 \end{aligned}$$

n variables
d matrix const.
n sign const.

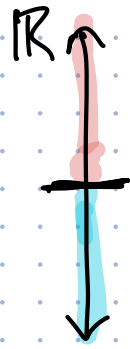
The Fundamental Theorem of Linear Programming. A canonical linear program P has an optimal solution x^* if and only if the dual linear program D has an optimal solution y^* such that $\underbrace{c \cdot x^*}_{\text{objective values}} = y^* A x^* = \underbrace{y^* \cdot b}_{\text{objective values}}$.

weak duality

Weak duality: IF x feasible for primal
 y feasible for dual
Then $c \cdot x \leq y A x \leq y \cdot b$

Proof: x is feasible $\Rightarrow Ax \leq b \xrightarrow{y \geq 0} yAx \leq yb$
 x is feasible $\Rightarrow x \geq 0 \xrightarrow{yA \geq c} yAx \leq yb$

primal-dual gap

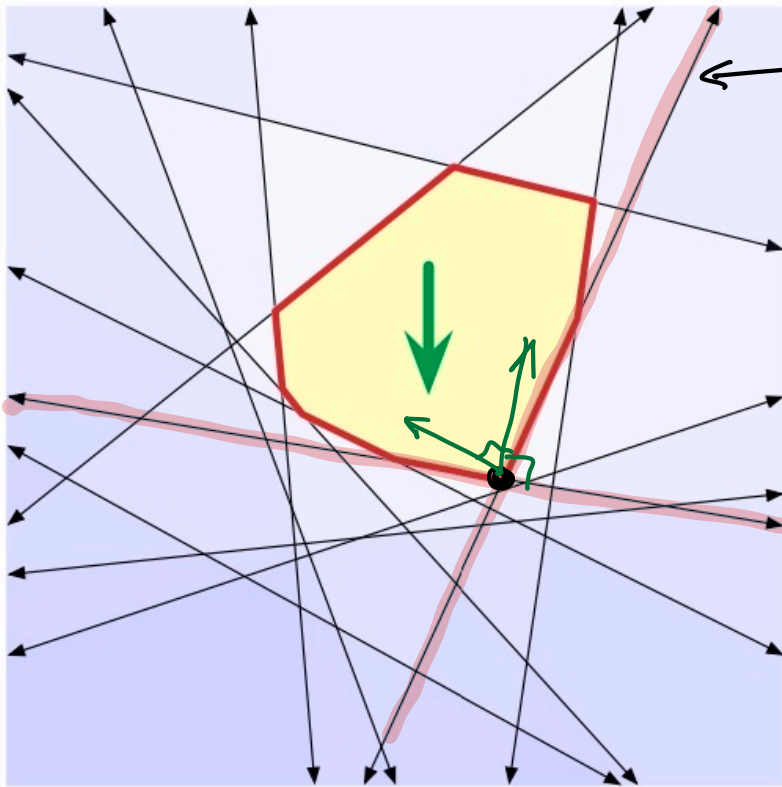


$$\{y \cdot b \mid yA \geq c, y \geq 0\}$$

Weak duality \Rightarrow no overlap

$$\{c \cdot x \mid Ax \leq b, x \geq 0\}$$

Strong \Rightarrow touch



\leftarrow tight = satisfied with equality

dual variables for optimal solution

= coefficients of $-c$ in coord frame defined by tight primal const

dual variable = primal const

dual $D \Leftrightarrow$ primal constraint is loose

Basis = d ~~linearly independent~~ constraints

Assume no degeneracies

location of basis = point

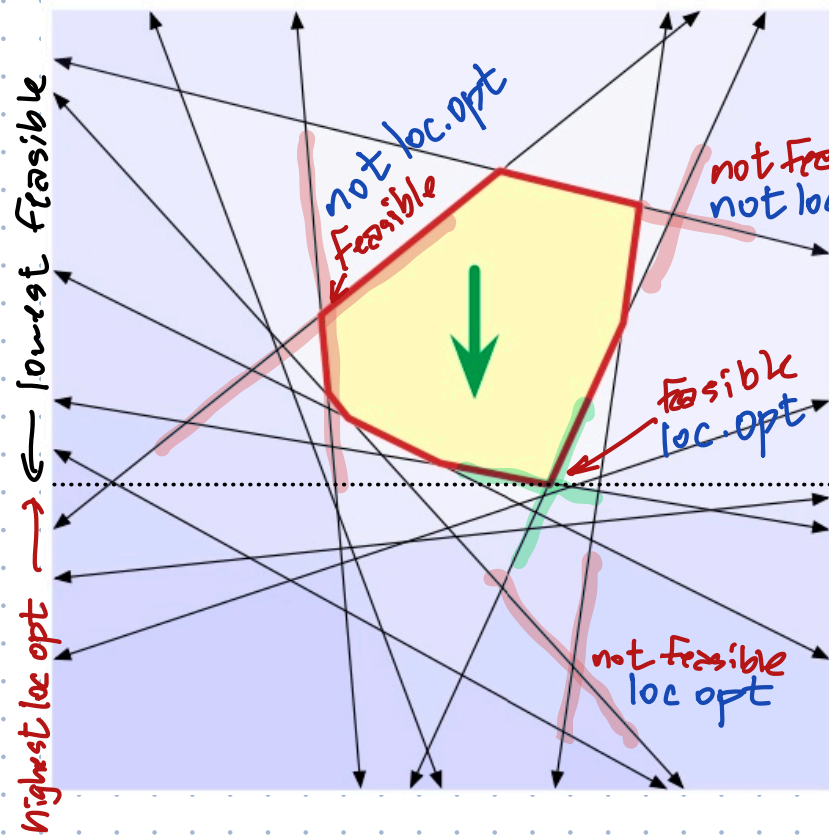
= solution to system of eqns

= intersection of d constraint planes

value of basis = $c \cdot$ location

There are $\binom{n+d}{d} = \binom{d+n}{n}$ bases

basis



A basis is feasible

$$\text{if } Ax \leq b \\ x \geq 0$$

where $x = \text{location}$

A basis is locally optimal
= dual feasible

= optimal for LP containing
only the constraints
in the basis

optimal = feasible and
loc. optimal



primal-dual dictionary

Primal

basis

value

$$\begin{pmatrix} n+d \\ d \end{pmatrix}$$

feasible

loc. opt

optimal

in feasible LP
bounded LP

Dual

(complement of) basis

value

$$\begin{pmatrix} d+n \\ n \end{pmatrix}$$

loc. opt.

feasible

optimal

un bounded LP
feasible LP

Basis B is a neighbor of basis B' if $|B \setminus B'| = 1$

PRIMALSIMPLEX(H):

if $\cap H = \emptyset$

return INFEASIBLE

$x \leftarrow$ any feasible vertex

while x is not locally optimal

⟨⟨pivot downward, maintaining feasibility⟩⟩

if every feasible neighbor of x is higher than x

return UNBOUNDED

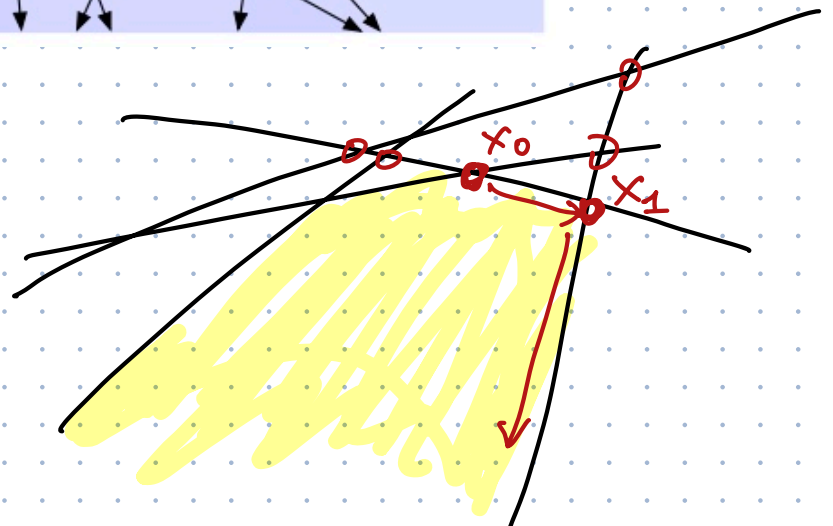
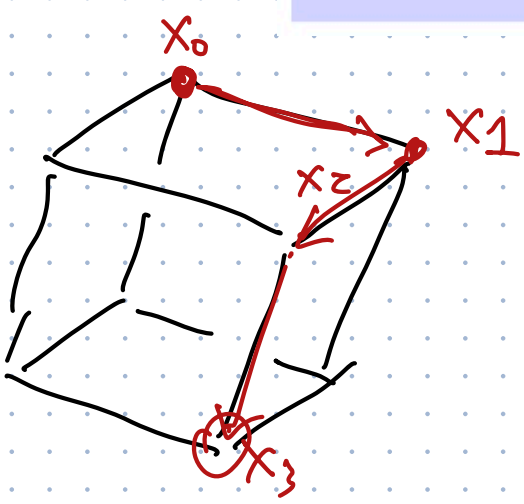
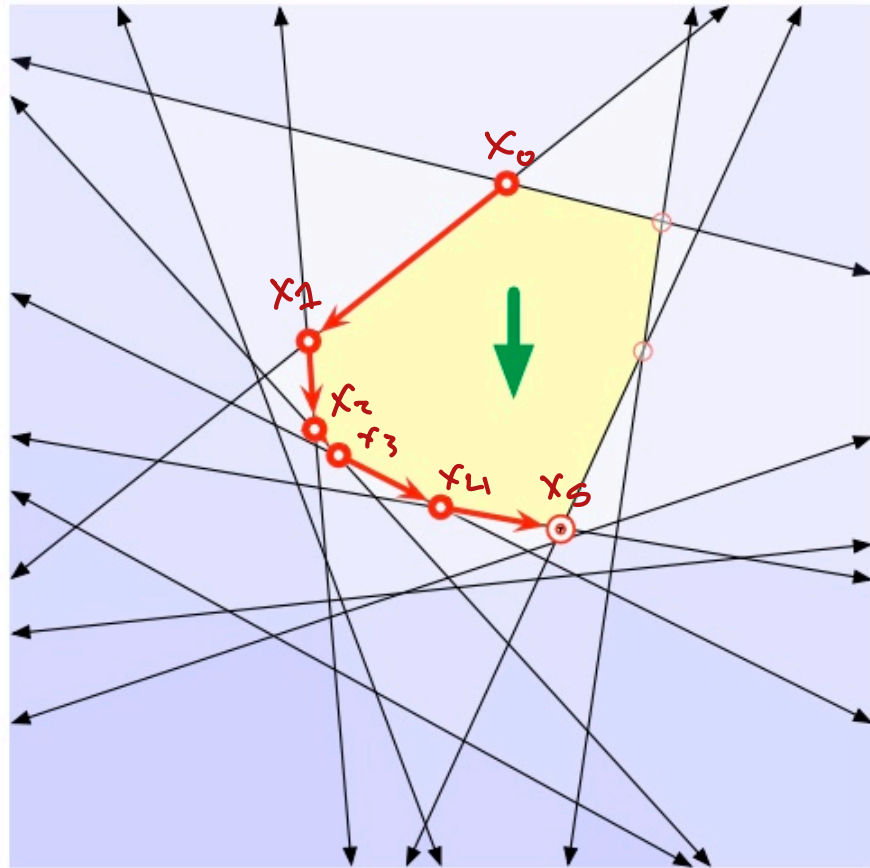
else

$x \leftarrow$ any feasible neighbor of x that is lower than x

return x

magic
(for now)

Feasibility
doesn't depend
on c .

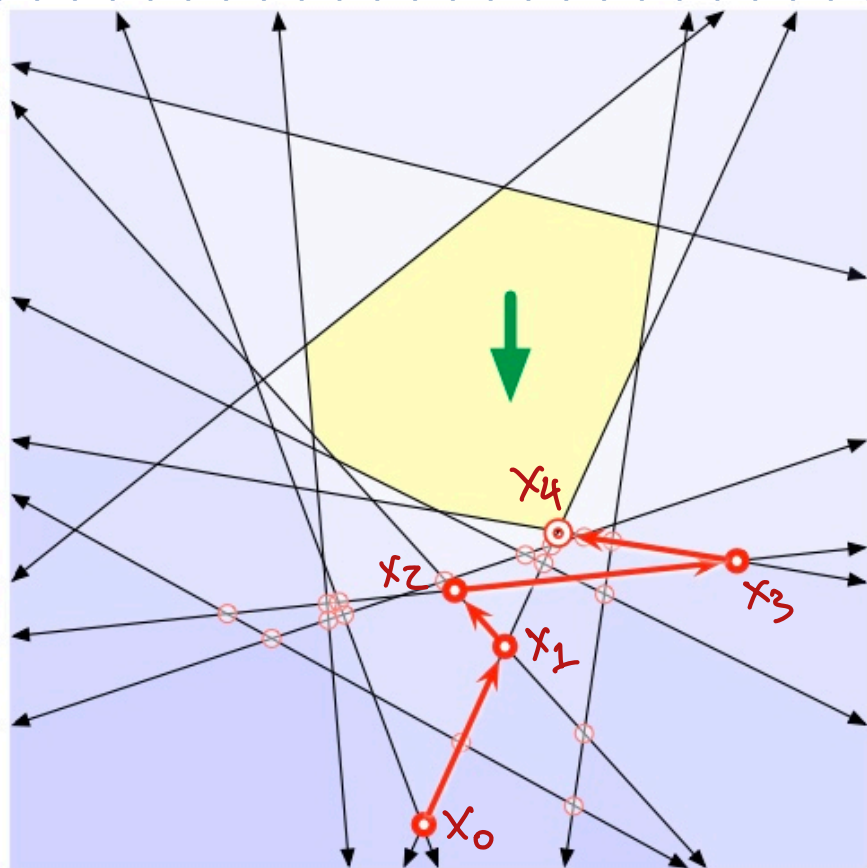


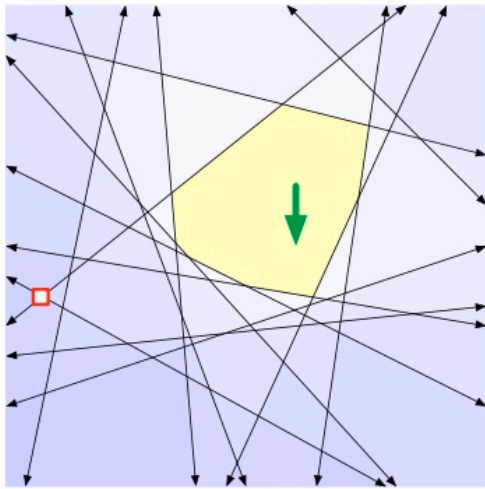
DUALSIMPLEX(H):

```
if there is no locally optimal vertex
  return UNBOUNDED
x ← any locally optimal vertex
while x is not feasible
  ⟨⟨pivot upward, maintaining local optimality⟩⟩
  if every locally optimal neighbor of x is lower than x
    return INFEASIBLE
  else
    x ← any locally-optimal neighbor of x that is higher than x
return x
```

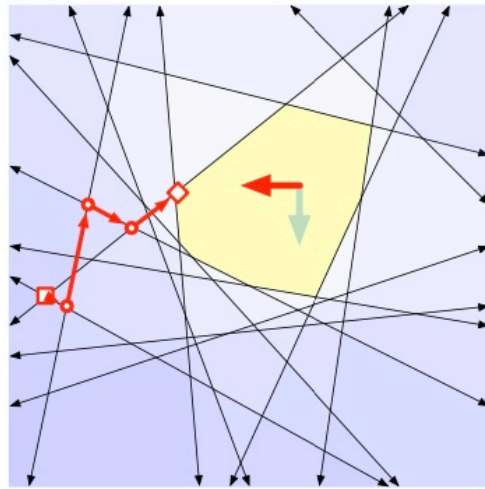
dual
magic
(for now)

lo opt
doesn't
depend on b

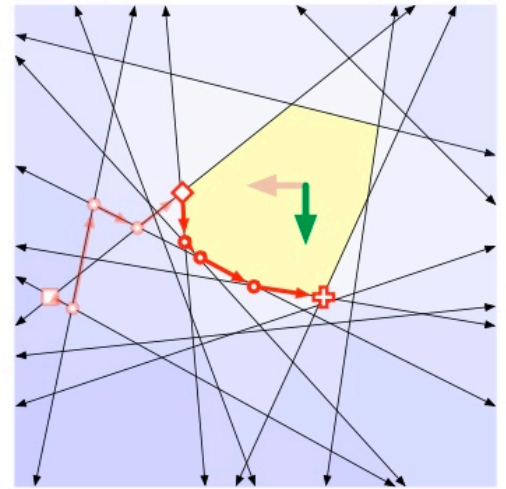




(a)



(b)



(c)

DUALPRIMALSIMPLEX(H):

$x \leftarrow$ any vertex

$\tilde{H} \leftarrow$ any rotation of H that makes x locally optimal

while x is not feasible

if every locally optimal neighbor of x is lower (wrt \tilde{H}) than x

return INFEASIBLE

else

$x \leftarrow$ any locally optimal neighbor of x that is higher (wrt \tilde{H}) than x

while x is not locally optimal

if every feasible neighbor of x is higher than x

return UNBOUNDED

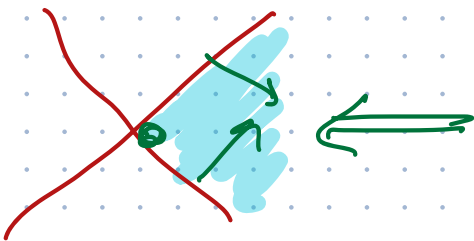
else

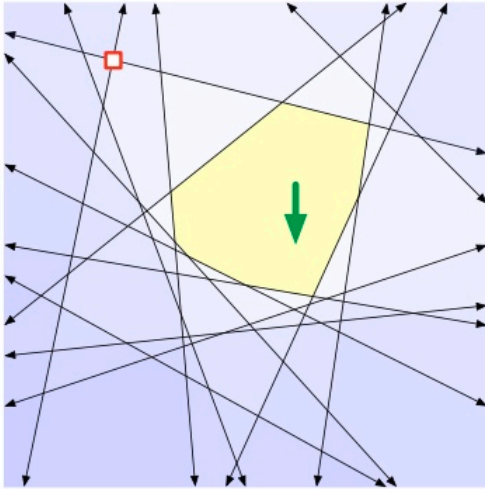
$x \leftarrow$ any feasible neighbor of x that is lower than x

return x

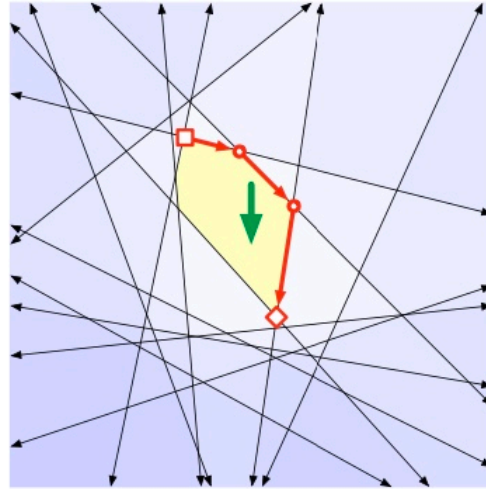
Dual

Primal

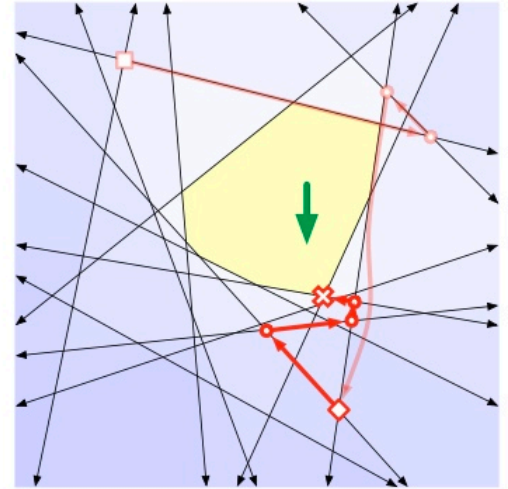




(a)



(b)



(c)

PRIMALDUALSIMPLEX(H):

$x \leftarrow$ any vertex

$\tilde{H} \leftarrow$ any translation of H that makes x feasible

while x is not locally optimal

if every feasible neighbor of x is higher (wrt \tilde{H}) than x

return UNBOUNDED

else

$x \leftarrow$ any feasible neighbor of x that is lower (wrt \tilde{H}) than x

while x is not feasible

if every locally optimal neighbor of x is lower than x

return INFEASIBLE

else

$x \leftarrow$ any locally-optimal neighbor of x that is higher than x

return x

primal

dual