

Crazy Picture.

Maximum matching and simplex.

$\max x + y + z$
 $x \leq 1$
 $x + z \leq 1$ $a = 1$
 $z + y \leq 1$ $b = 1$
 $y \leq 1$
 $x \geq 0$
 $y \geq 0$
 $z \geq 0$ $c = 1$

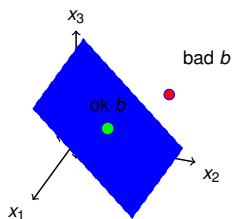
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 Sum: $x + 2z + y$.

 Augmenting Path. Via Gaussian Elimination!

Convex Separator.
Farkas
Strong Duality!!!! Maybe.

Linear Equations.

$Ax = b$
 A is $n \times n$ matrix...
 ..has a solution.
 If rows of A are linearly independent.
 $y^T A \neq 0$ for any y
 ..or if b in subspace of A .



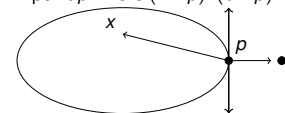
Strong Duality.

Later. Actually. No. Now ...ish.
 Special Cases:
 min-max 2 person games and experts.
 Max weight matching and algorithm.
 Approximate: facility location primal dual.
 Today: Geometry!

Convex Body and point.

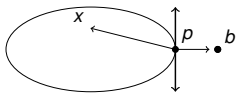
For a convex body P and a point b , $b \in P$ or hyperplane separates P from b .

v, α , where $v \cdot x \leq \alpha$ and $v \cdot b > \alpha$.
 point p where $(x - p)^T (b - p) < 0$



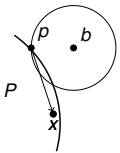
Proof.

For a convex body P and a point $b, b \in A$ or there is point p where $(x-p)^T(b-p) < 0$



Proof: Choose p to be closest point to b in P .

Done or $\exists x \in P$ with $(x-p)^T(b-p) \geq 0$



$(x-p)^T(b-p) \geq 0$
 $\rightarrow \leq 90^\circ$ angle between $\overrightarrow{x-p}$ and $\overrightarrow{b-p}$.

Must be closer point b on line from p to x .

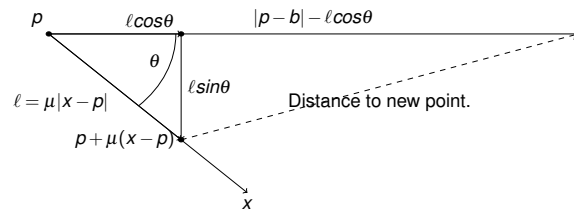
All points on line to x are in polytope.

Contradicts choice of p as closest point to b in polytope.

More formally.



Squared distance to b from $p + (x-p)\mu$ point between p and x
 $(|p-b| - \mu|x-p|\cos\theta)^2 + (\mu|x-p|\sin\theta)^2$
 θ is the angle between $x-p$ and $b-p$.



Simplify:

$$|p-b|^2 - 2\mu|p-b||x-p|\cos\theta + (\mu|x-p|)^2.$$

Derivative with respect to μ ...

$$-2|p-b||x-p|\cos\theta + 2(\mu|x-p|^2).$$

which is negative for a small enough value of μ (for positive $\cos\theta$.)

Generalization: exercise.

Theorems of Alternatives.

Linear Equations: There is a separating hyperplane between a point and an affine subspace not containing it.

From $Ax = b$ use row reduction to get, e.g., $0 \neq 5$.

That is, find y where $y^T A = 0$ and $y^T b \neq 0$.

Space is image of A . Affine subspace is columnspan of A .

y is normal. y in nullspace for column span.

$y^T b \neq 0 \implies b$ not in column span.

There is a separating hyperplane between any two convex bodies.

Idea: Let closest pair of points in two bodies define direction.

Farkas 2

Farkas A: Solution for exactly one of:

- (1) $Ax = b, x \geq 0$
- (2) $y^T A \geq 0, y^T b < 0$.

Farkas B: Solution for exactly one of:

- (1) $Ax \leq b$
- (2) $y^T A = 0, y^T b < 0, y \geq 0$.

Strong Duality

(From Goemans notes.)

Primal P $z^* = \min c^T x$

$$Ax = b$$

$$x \geq 0$$

Dual D: $w^* = \max b^T y$

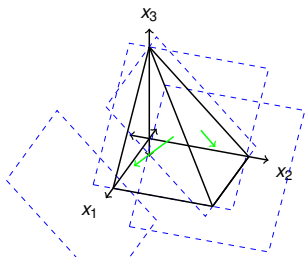
$$A^T y \leq c$$

Weak Duality: x, y -feasible P, D: $x^T c \geq b^T y$.

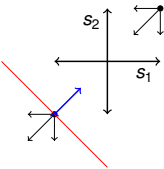
$$\begin{aligned} x^T c - b^T y &= x^T c - x^T A^T y \\ &= x^T (c - A^T y) \\ &\geq 0 \end{aligned}$$

$$Ax = b, x \geq 0$$

$$\begin{bmatrix} 11 & 00 & 11 \\ 00 & 11 & 11 \end{bmatrix} x = \begin{bmatrix} 11 \\ 11 \end{bmatrix}$$



Coordinates $s = b - Ax$.
 $x \geq 0$ where $s = 0$?



y where $y^T (b - Ax) < y^T (0) < 0$ for all $x \geq 0 \rightarrow y^T b < 0$ and $y^T A \geq 0$.

Farkas A: Solution for exactly one of:

- (1) $Ax = b, x \geq 0$
- (2) $y^T A \geq 0, y^T b < 0$.

Strong duality If P or D is feasible and bounded then $z^* = w^*$.

Primal feasible, bounded, value z^* .

Claim: Exists a solution to dual of value at least z^* .

$$\exists y, y^T A \leq c, b^T y \geq z^*.$$

Want y .

$$\begin{pmatrix} A^T \\ -b^T \end{pmatrix} y \leq \begin{pmatrix} c \\ -z^* \end{pmatrix}.$$

If none, then Farkas B says

$$\exists x, \lambda \geq 0.$$

$$(A \quad -b) \begin{pmatrix} x \\ \lambda \end{pmatrix} = 0 \quad (c^T \quad -z^*) \begin{pmatrix} x \\ \lambda \end{pmatrix} < 0$$

$$\exists x, \lambda \text{ with } Ax - b\lambda = 0 \text{ and } c^T x - z^* \lambda < 0$$

Case 1: $\lambda > 0$. $A(\frac{x}{\lambda}) = b$, $c^T(\frac{x}{\lambda}) < z^*$. Better Primal!!

Case 2: $\lambda = 0$. $Ax = 0$, $c^T x < 0$.

Feasible \tilde{x} for Primal.

(a) $\tilde{x} + \mu x \geq 0$ since $\tilde{x}, x, \mu \geq 0$.

(b) $A(\tilde{x} + \mu x) = A\tilde{x} + \mu Ax = b + \mu \cdot 0 = b$. Feasible

$$c^T(\tilde{x} + \mu x) = c^T \tilde{x} + \mu c^T x \rightarrow -\infty \text{ as } \mu \rightarrow \infty$$

Primal unbounded!

See you on Tuesday.