



Combinatorial Optimization :

Matchings, Matroids and the Travelling Salesman

On the crossroad of the postman and the salesman



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support for an advanced course in Buenos Aires

Exercises to revise for the first course : series 4 and 5.

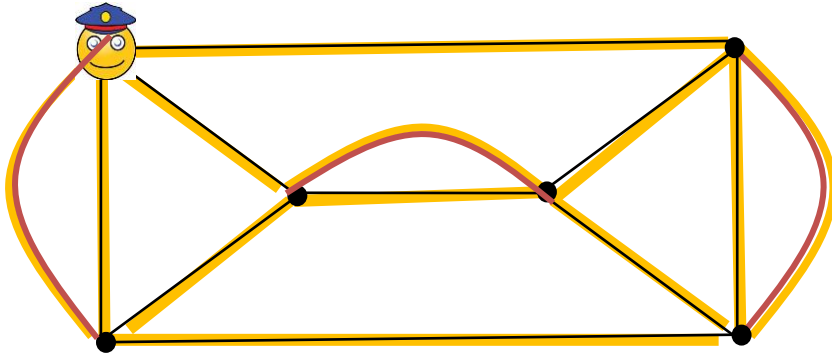
What is combinatorial optimization ?

Given $f : 2^S \rightarrow \mathbb{R}$, find $X \subseteq S$ that minimizes f ,
that is, such that $f(X) \leq f(Y)$ for all $Y \subseteq S$.

TOO GENERAL, NOT EXACT, IRRELEVANT, NOT TRUE, DRY, BORING,
IGNORING IMPORTANT ASPECTS LIKE COMPLEXITY ISSUES ...

We have to go through more specific, structured examples !

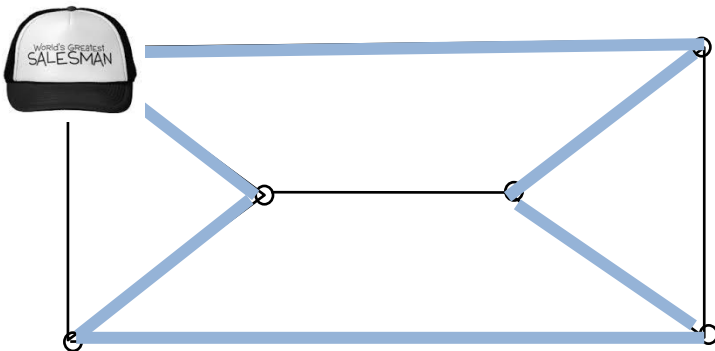
The postman



Edges = streets
Do all the streets
and come back !

In P
(Edmonds, Johnson 73)

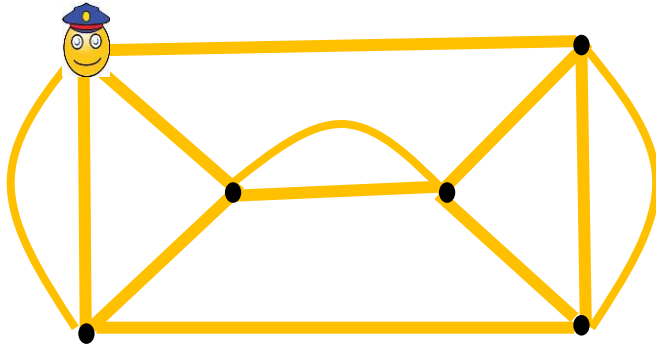
The Travelling Salesman



Vertices = Cities
Do all the cities
and come back !

NP-hard
(Karp, 1972)

The (Chinese) postman problem



Euler's theorem : $G = (V, E)$, E : streets
 One can go through all the streets exactly once \Leftrightarrow
 \forall Degree is even & G is connected, i.e. Eulerian)

min « Eulerian replication » ?

= min "Eulerian duplication"

= min cardinality of a set F with $d_F(v) \equiv d_G(v) \pmod{2} \quad \forall v \in V$

postman set

Exercise 4.1

Proposition : A postman set P is minimum $\Leftrightarrow w(e) := \begin{cases} -1 & \text{if } e \in P \\ 1 & \text{if } e \notin P \end{cases}$ has no circuit of negative total weight

Exercise 4.2.

TSP

TSP PATH

INPUT : V cities, $s, t \in V$, $c: V \times V \rightarrow \mathbb{R}_+$ métrique, cad
$$c(uv) + c(vw) \geq c(uw) \quad \forall u, v, w \in V$$

OUTPUT: shortest Hamiltonian path between s and t .

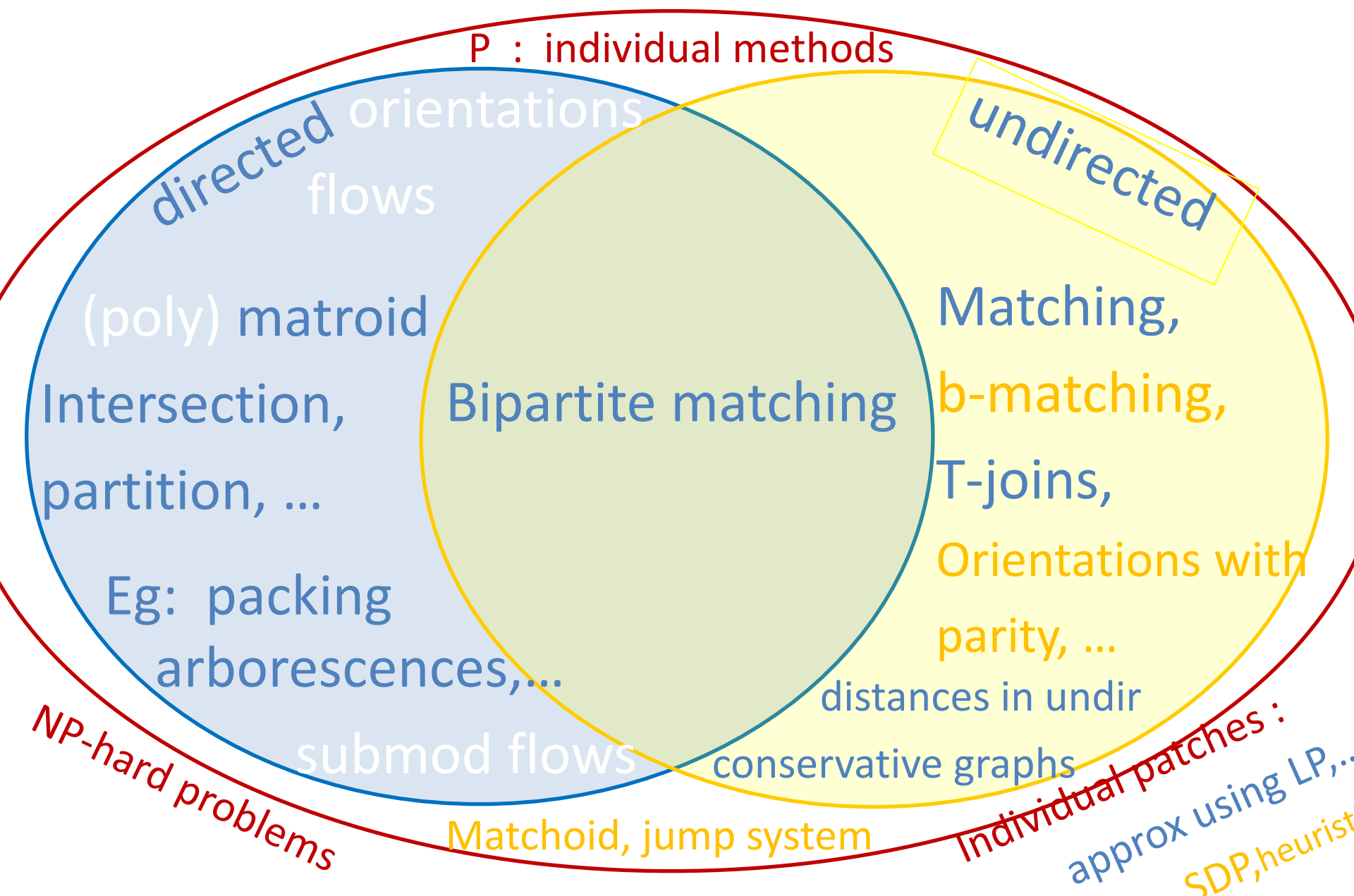
GRAPH-TSP PATH:

$c(uv) :=$ minimum cardinality of an (u,v) -path in INPUT graph $G=(V,E)$.

GRAPHE- TSP : $s=t$

$c \in \{1, \infty\}$ any approx \supseteq HAM ; the metric condition usually holds

Directions from bird's eyes ...



Our program

1. Bin packing (cutting stock, scheduling), how to look at it ?

LP, Total Dual Integrality, Integer Decomposition and Hilbert Bases

Paths (GPS, PERT, ...), what can be solved ?

Cuts (routing, clustering) various problems, different ways ...

2. Matching (marriages, scheduling) undirected shortest paths

Tours : the salesman and the postman

3. Submodular functions (machine learning, network design), matroids

4. Matroid intersection, context and applications

5. Recent progress in approximating the TSP (using what we learnt)

Bin packing

BIN PACKING

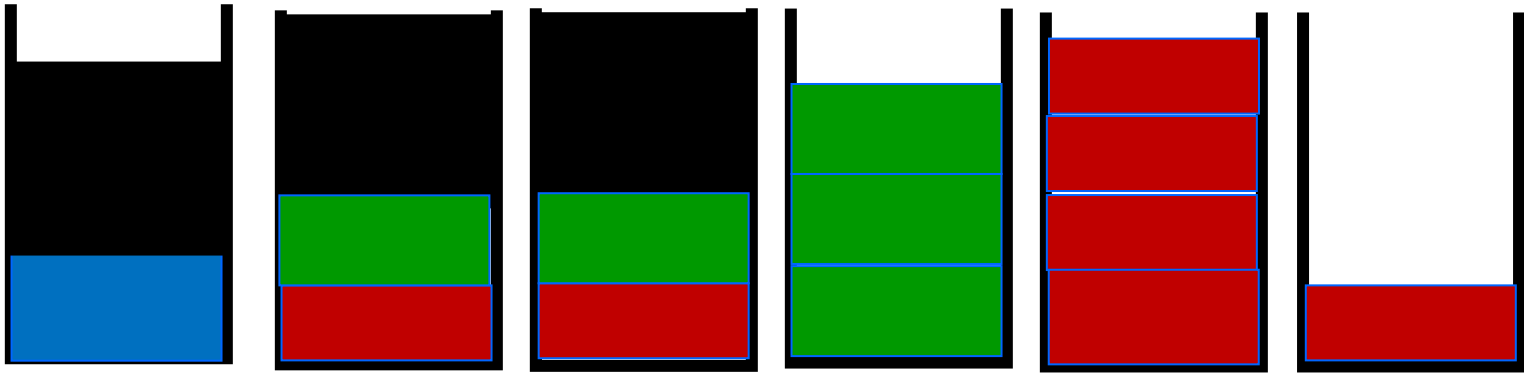
Input : $0 \leq s_1, \dots, s_n \leq 1$ item sizes,

Task : Minimize the **number of bins** (capacity 1)

PARTITION : Are 2 bins enough ?

NP-hard

Bin packing (picture)



Bin packing (heuristics)

BIN PACKING

Input : $0 \leq s_1, \dots, s_n \leq 1$ item sizes,

Task : Minimize the **number of bins** (capacity 1)

Heuristics : NF,

FF,

NFD,

FFD

2

$17/10$

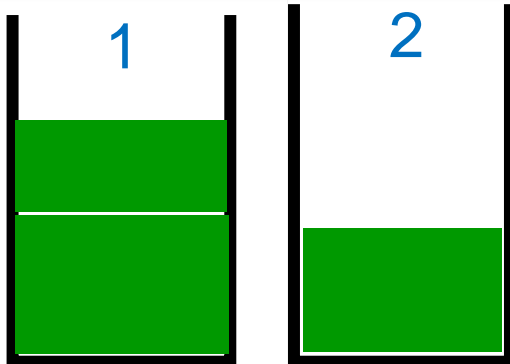
$11/9$ OPT

+1

Proposition : $NF \leq 2 \text{ OPT}$

- 1 ? **Exercise**

Proof :



> 1

...

$\text{OPT} \geq \lceil \text{size} \rceil$
 $NF < 2 \text{ size} + 1$

Bin packing (patterns)

INPUT : $0 \leq s_1, \dots, s_d \leq 1$ item sizes,
 $b_1, \dots, b_d \in \mathbb{IN}$ item multiplicities

Pack them to a **min number of bins** of capacity 1

pattern : $\mathbf{p} \in \mathbb{IN}_+^d$ such that $p_1 s_1 + \dots + p_d s_d \leq 1$

$P :=$ the columns are the inclusionwise max patterns

Bin packing (example)

$d=3$

$s=(1/2, 1/3, 1/5)$ $b=(1, 2, 4)$

								b
	2	0	0	1	1	0	0	1
P=	0	3	0	1	0	2	1	2
	0	0	5	0	2	1	3	4

SIZE = $59/30$ LP = $\frac{1}{2} + \frac{2}{3} + \frac{4}{5} = 59/30$

Exercise : OPT = 2 or 3 ?

Bin packing (LP)

pattern : $p \in \mathbb{IN}_+^d$ such that $p_1 s_1 + \dots + p_d s_d \leq 1$

Gilmore-Gomory LP :

$$\begin{array}{ll} \mathbf{Px} \geq \mathbf{b} & (P \in \mathbb{IN}_+^{d \times \text{big}}) \\ \mathbf{x} \geq \mathbf{0} & \\ \min \mathbf{1}^T \mathbf{x} & (\mathbf{b} \in \mathbb{IN}_+^d) \end{array} = \begin{array}{l} \mathbf{yP} \leq \mathbf{1} \\ \mathbf{y} \geq \mathbf{0} \\ \max \mathbf{1}^T \mathbf{y} \end{array}$$

Conjecture (Scheithauer, Terno):
(not better for restricted patterns)

$$\text{OPT} \leq \lceil \text{LP} \rceil + 1$$

Linear Programming

Duality Theorem

$$Ax \leq b$$

$$(A \in \mathbf{Q}^{m \times n}, b, c \in \mathbf{Q}^n)$$

$$\max c^T x$$

dual:

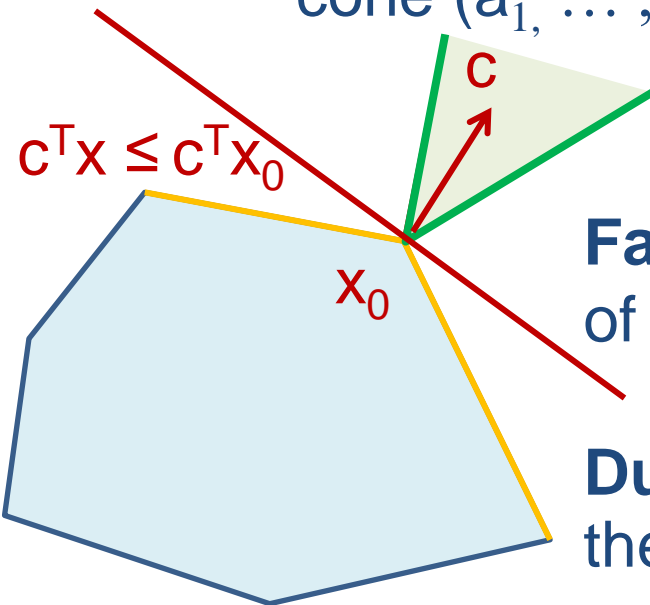
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$$yA = c$$

$$y \geq 0$$

$$\min y^T b$$

$$\text{cone}(a_1, \dots, a_m) := \left\{ \sum \lambda_i a_i : \lambda_i \geq 0, i=1, \dots, m \right\}$$



Farkas Lemma: Every 'tight' consequence of linear inequalities is their nonneg.lin.comb.

Duality Theorem \Leftrightarrow If the max for c is $c^T x_0$, then c is a nonneg.lin.comb of a_i with $a_i^T x_0 = b_i$

Linear Programming

Carathéodory's theorem

Fact : (Carathéodory) $v \in \text{cone}(a_1, \dots, a_m) \subseteq \mathbb{R}^n \Rightarrow$
 v is also a **nonneg. comb of a linearly independent subset**

Proof : $v = \lambda_1 a_1 + \dots + \lambda_k a_k : \lambda_i > 0$ ($i=1, \dots, k$). If lin. dep:
 $0 = \alpha_1 a_1 + \dots + \alpha_k a_k$ **not all α_i are nonnegative.**

Add the right multiple of the second to the first.

Exercise: It is possible to do this so as at the same time

- to have one less nonzero coefficient
- to maintain the nonnegativity of all coefficients.

Q.E.D. « \exists solution $\Rightarrow \exists$ basic solution »

Linear Programming

Integer Solutions

$$\mathbf{Ax} \leq \mathbf{b}$$

$$(A \in \mathbf{Q}^{m \times n}, b, c \in \mathbf{Q}^n)$$

$$\max c^T x$$

dual:

=

$$yA = c$$

$$y \geq 0$$

$$\min y^T b =: \text{LIN}$$

integer polyhedron $\mathbf{Ax} \leq \mathbf{b}$ if $\forall c$
the LIN is integer \Leftrightarrow
vertices (if any) are integer.

Totally dual integral (TDI) :

$\mathbf{Ax} \leq \mathbf{b}$, if $\text{LIN} =$

$\{\min y^T b, yA = c, y \geq 0, y \text{ integer}\}$

integer rounding, if $\forall c : \{\min y^T b, yA = c, y \geq 0, y \text{ integer}\} = \lceil \text{LIN}(c) \rceil$

TDI system = IR system & integer polyhedron

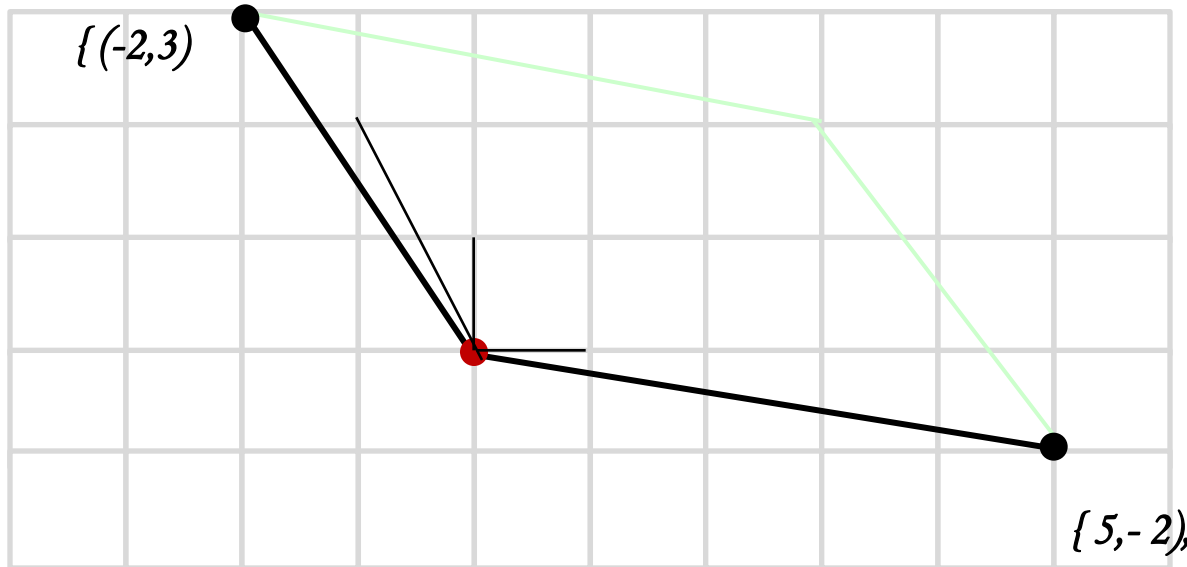
Linear Programming

Hilbert bases (normal semigroups)

$H \subseteq \mathbb{Z}^n$ is a *Hilbert basis* if any **nonneg comb** which is also an **integer comb** is also a **nonneg integer comb**

Example $n=2$:

pointed cone : cone $\{ (-2,3), (5,-1) \}$ $|\det| = 13$



adding $(-1,2), (0,1), (1,0) \}$: Hilbert basis

Integer Caratheodory property (+ 'partition' into unimodular cones)

Linear programming

Normal semigroups

Schrijver : $Ax \leq b$ TDI \Leftrightarrow if $\forall x_0$ the equalities for x_0 form a H.b.
Full dim \Rightarrow unique minimal TDI System (Schrijver sys.)

s,t paths and cuts, matching polytope, spanning trees, arborescences,
bin packing, matroids and submodular polyhedra,

Gomory-Chvátal procedure, integer hull ... :
rounding down the Schrijver system.

Integer Caratheodory property holds in 2 and 3 dim.

General Integer Caratheodory bound in n dim: $2n - 2$, open in gen.

General Integer Programming :

Gomory-Chvátal, Lovász-Schrijver, Balas, Ceria, etc ...

Bin packing (LP)

Theorem (McCormick, Smallwood, Spieksma 1990) : For two different item sizes $OPT \leq \lceil LP \rceil$ and can be found in poly. time.

Exercise* : Suppose $d=2$, and prove that $\{ (p,1) : p \text{ is a pattern} \}$ is a Hilbert basis

Hint: Show that any three linearly independent vectors among these not containing a fourth one, form a Hb.

Theorem (Sebő, Shmonin 2006-) : For at most 7 different item sizes, $OPT \leq \lceil LP \rceil + 1$ and can be “easily” found (Conj. True)

Theorem (Jansen, Solis-Oba 2011) : For any fixed number of item sizes $OPT+1$ can be found in polynomial time.

Paths in Graphs

Directed, **nonnegative** weights (Dijkstra)

-1 weights NP-hard (HAM)

Conservative (no circuit of neg total weight): $\in P$

Undirected shortest paths with nonnegative weights ?

With -1 weights ?

With a conservative weighting ?

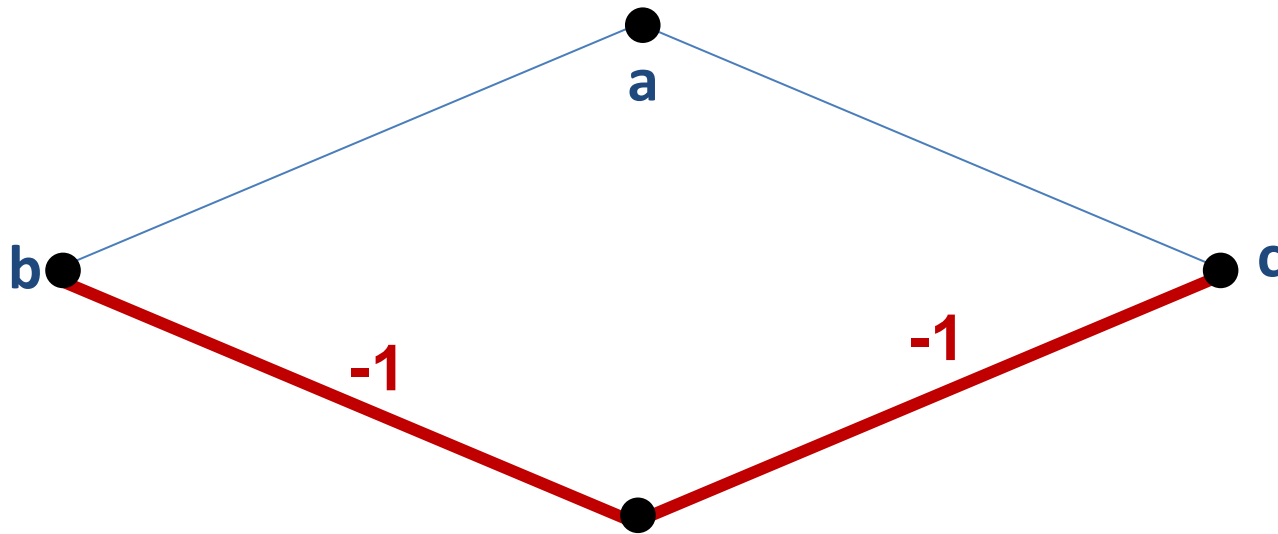
Exercise : Does the triangle inequality hold in the undirected case ? Are subpaths of shortest paths shortest ?

Can we solve undirected shortest path problems in the same way as directed ones ? Or reduce one to the other ?

Conservativeness

Def: (G,w) where G is a graph, $w: E(G) \rightarrow Z$ is *conservative*, if for every circuit C of G : $w(C) \geq 0$.

$$\lambda(x,y) := \lambda_w(x,y) := \min \{w(P) : P \text{ path}\} = \min \{w(P) : P \text{ } \{x,y\}\text{-join}\}$$



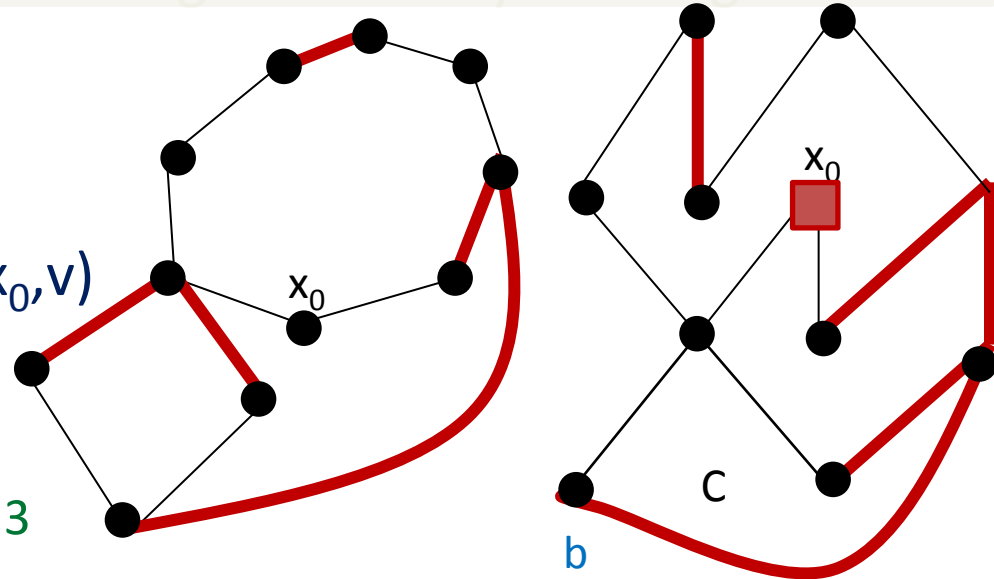
$$\lambda(a,b) = \lambda(a,c) = -1 \quad ; \quad \lambda(b,c) = -2 \quad ; \quad \lambda(a,b) + \lambda(b,c) < \lambda(a,c)$$

A shortest (a,c) -path is not shortest between a and b .

A Quick Proof of Seymour's theorem

Theorem: G bipartite, $w:E(G) \rightarrow \{-1,1\}$, (G,w) conservative \Leftrightarrow
 E_- can be covered by disjoint cuts meeting it in exactly one edge each.

Proof $x_0 \in V(G)$
 (Sebő) Take $b \neq x_0$ such that
 $\lambda_w(x_0, b) = \min_{v \in V(G)} \lambda_w(x_0, v)$

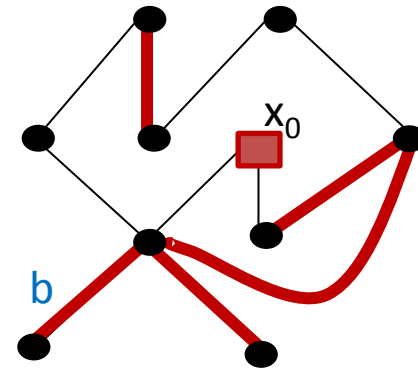


Claim 1 $|\delta(b) \cap E_-| = 1$
 Exercise 5.3

Claim 2 : Switching on C , $w(C)=0$:

- a. Remains conservative
- b. Distances don't change

Exercise 5.1



Claim 3: Contracting $\delta(b)$, a., (and b.) remain true! Exercise 5.4

Cuts

Input : $G=(V,E)$, $c: E \rightarrow \mathbb{Q}$

Output: Partition $\{X, Y\}$ of V that

minimizes $\sum_{x \in X, y \in Y, xy \in E} c(xy)$

minimum cut : c non-negative

$\in \mathcal{P}$

maximum cut : c non-positive

\mathcal{NP} - complete

Randomized 2-approx : Flip a coin !
2-approx : Derandomize !

Cuts

Short Summary

MIN CUT $\in \mathcal{P}$

MAX CUT NP-hard

Ford Fulkerson: algorithm and MFMC thm. (Improvements, analysis since then ...)
Menger's theorems.

Goldberg-Tarjan : preflow push

Karger : uniform distribution on edges.
Choose an edge, contract, stop if $|V|=2$.

Nagamochi-Ibaraki has been known
(is maybe the derandomization of Karger)

NP-hard, even max | | see GJ.

In planar graphs = Chinese postman problem. $\in \mathcal{P}$

Exercise: why ? (Hint : a cut is max iff 1 on it and -1 else, Is conservative in the dual)

0.878-approx:

Goemans-Williamson with Semidefinite Programming



To come :
Matchings,
Undirected Shortest Paths,
T-joins

...

Exercises to revise for the second course: series 3 and 6

