

Mini-course
Packing & covering



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Part I : Introduction

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Part I : Introduction

Part II : Perfection

Part III : Idealness

Part IV : The Mengerian property

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Part IV : The Mengerian property

The Set packing problem

A max-min relation

Poset (V, \leq)

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Poset (V, \leq) , i.e. $\forall a, b, c \in V$,

- $a \leq a$
- $a \leq b \wedge b \leq a \implies a = b$
- $a \leq b \wedge b \leq c \implies a \leq c$

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 a, b incomparable otherwise

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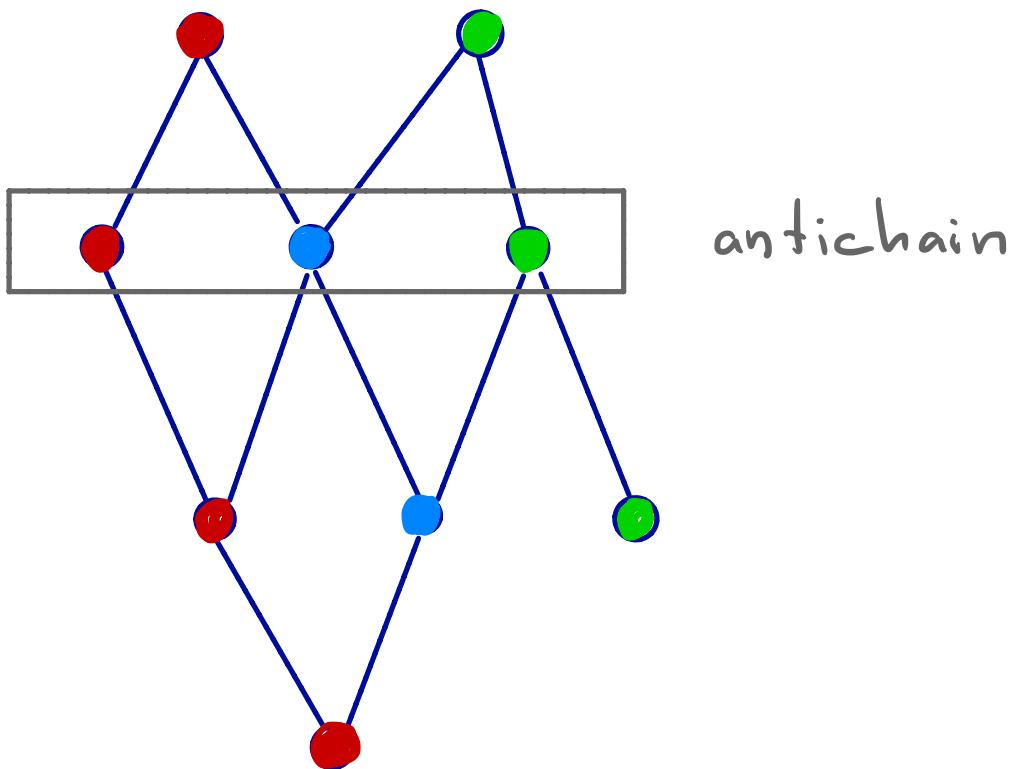
Qu: maximum size of antichain ?

Th: [Dilworth]

max size of antichain =
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An Integer Programming framework

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Let M be $m \times n$ 0,1 matrix, $w \in \mathbb{R}_+^n$

def: Set Packing IP

$$\max \{ w^T x : Mx \leq 1, x \geq 0, x \text{ integer} \} \quad (\text{IP})$$

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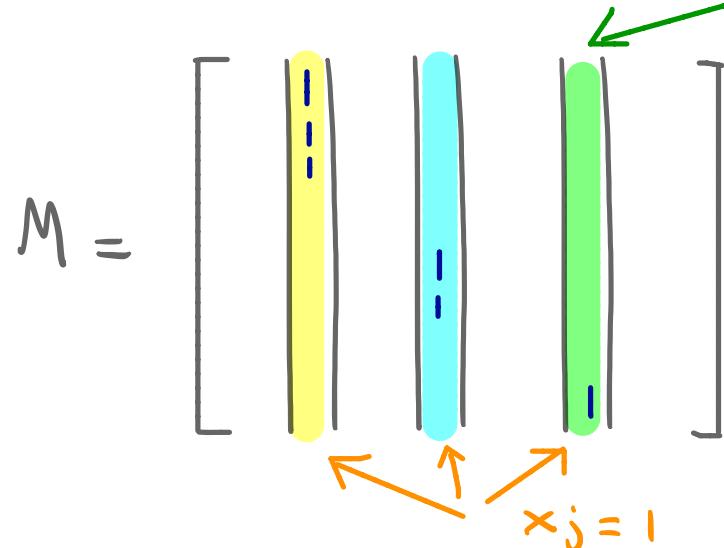
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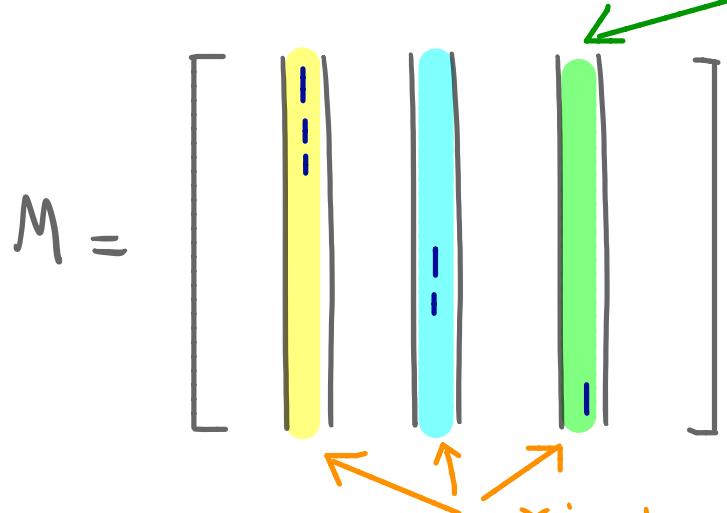
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Finds max weight family
of disjoint sets.

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Let $z_{\text{IP}}, z_{\text{P}}, z_{\text{D}}, z_{\text{ID}}$ be optimal values for
(IP), (P), (D), (ID) respectively,

$$\max \{ \mathbf{w}^T \mathbf{x} : M\mathbf{x} \leq \mathbf{1}, \mathbf{x} \geq \mathbf{0}, \mathbf{x} \text{ integer} \} \quad (\text{IP})$$

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Let $\mathbf{z}_{\text{IP}}, \mathbf{z}_p, \mathbf{z}_D, \mathbf{z}_{\text{ID}}$ be optimal values for
(IP), (P), (D), (ID) respectively, then

$$\mathbf{z}_{\text{IP}} \leq \mathbf{z}_p = \mathbf{z}_D \leq \mathbf{z}_{\text{ID}}$$

strong duality

Restating Dilworth's theorem

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(V, \leq) poset

M matrix where

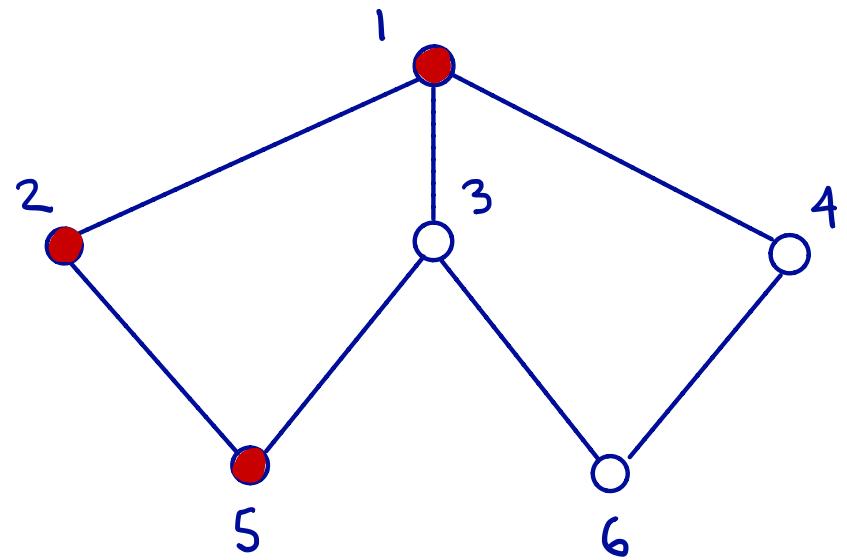
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Restating Dilworth's theorem

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$$M = \begin{bmatrix} 1 & 2 & 3 & 4 & 5 & 6 \\ 1 & 1 & 1 & 1 & 1 & 1 \\ 1 & & 1 & & 1 & \\ 1 & & & 1 & & \\ 1 & & & & 1 & \\ 1 & & & & & 1 \end{bmatrix}$$

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Question: What does (IP) finds for $w=1$?

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$$\max \quad 1^T x$$

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$$\left[\begin{array}{c} \\ \text{char. vector of chain} \\ \hline \text{1111} \end{array} \right] x \leq 1, \quad \begin{array}{l} x \geq 0, x \text{ integer} \\ \Leftrightarrow x \in \{0,1\}^V \end{array}$$

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$x \leq 1, \quad \underline{x \geq 0, x \text{ integer}}$

$\Leftrightarrow x \in \{0,1\}^V$

\implies finds maximum size antichain

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$$\left[\begin{array}{c|c|c} \text{yellow bar} & \text{cyan bar} & \text{green bar} \end{array} \right]$$

char. vector of chain

$$y \geq 1, \quad \underline{y \geq 0, y \text{ integer}}$$

$$\text{wma } y \in \{0,1\}^e$$

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char. vector of chain

\implies finds minimum set of chains covering V

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Then Dilworth's theorem



$$Z_{IP} = Z_{IO} \quad \text{for } w = 1$$

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Then Dilworth's theorem



$$\mathcal{Z}_{IP} = \mathcal{Z}_{ID} \quad \text{for } w = 1$$

Exercise :

Show, $\mathcal{Z}_{IP} = \mathcal{Z}_{ID}$ & $w \in \mathbb{Z}_+^V$.

What does this say in terms of posets ?

Three questions

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To address these questions we need
to review some polyhedral theory

Elements of polyhedral theory

Pr: Let $P = \{x \geq 0 : Ax \leq b\} \subseteq \mathbb{R}^n$.

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if $\forall w \in \mathbb{Z}^n$ where (D) has optimal sol.
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property of systems
not of polyhedra

Pr:

- ① $Ax \leq b, x \geq 0$ TDI & b integer \Rightarrow
- ② $\{x \geq 0 : Ax \leq b\}$ integral

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By char. of integral polyhedra ✓



Three questions – revisited

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① $z_{\text{IP}} = z_{\text{ID}}$ $\forall w \in \mathbb{Z}_+^n$ matrices satisfying ② & ③

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Thus ①, ②, ③ equivalent.

Perfection

def: A 0,1 matrix M is perfect if

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\Rightarrow study of perfect matrices =
study of perfect graphs.

The set covering problem

A min-max relation

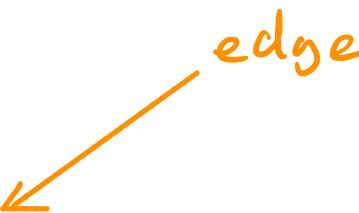
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Ih: [Menger]

Size of minimum st-cut =
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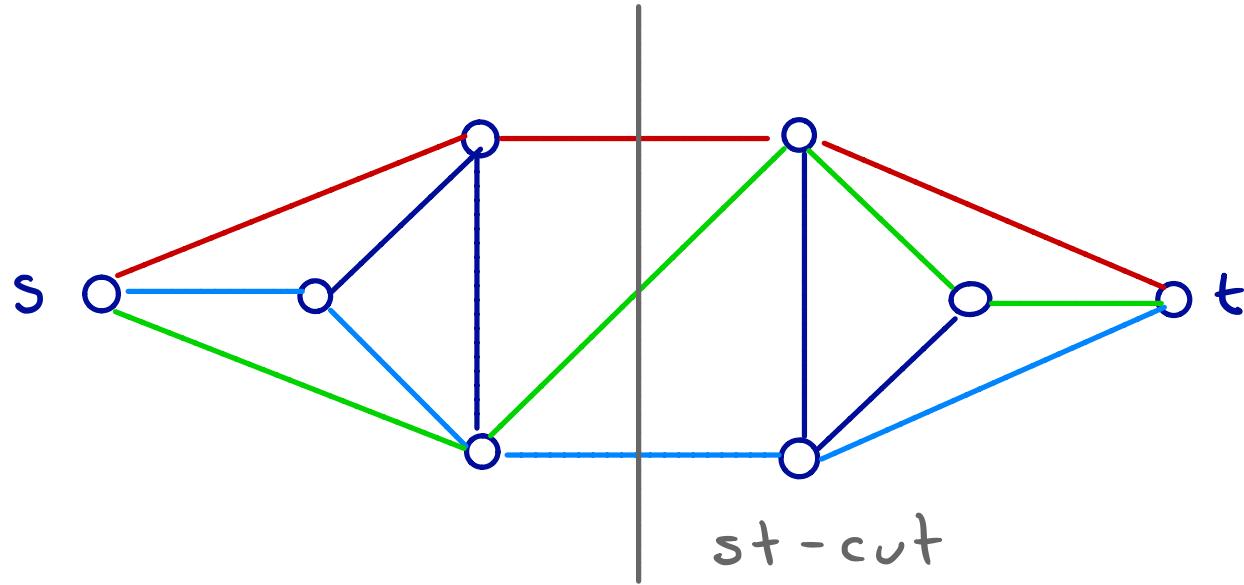
edge

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An Integer Programming framework

Let M be $m \times n$ 0,1 matrix, $w \in \mathbb{R}_+^n$

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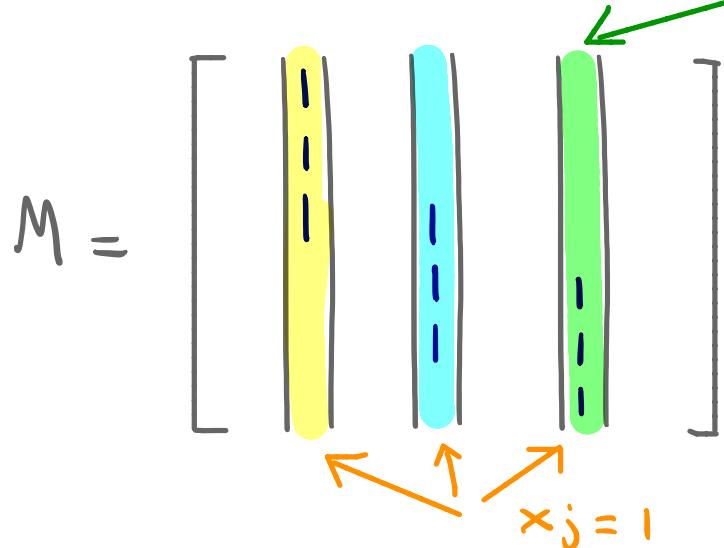
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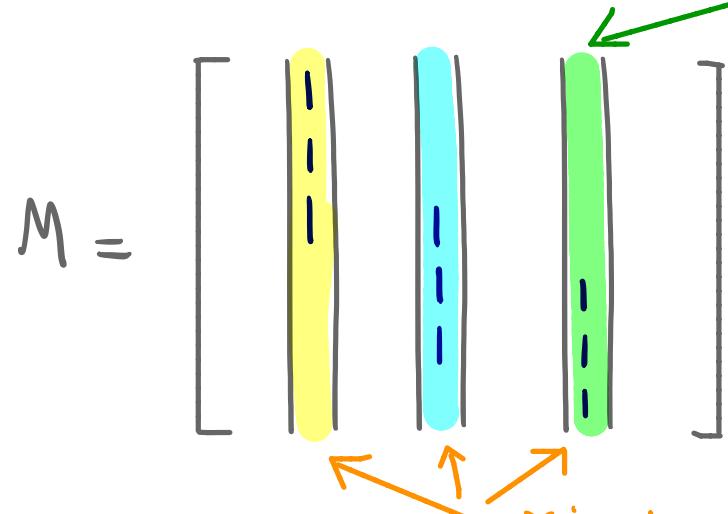
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incidence vector of set

Finds min weight family
of sets covering ground set

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Restating Menger's th

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M matrix where

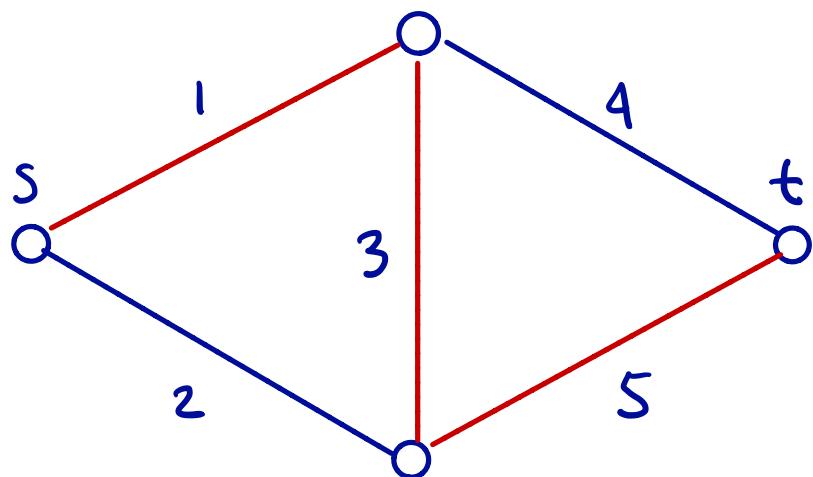
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$$M = \begin{bmatrix} 1 & 2 & 3 & 4 & 5 \\ 1 & & & & \\ 1 & & & & \\ 1 & 1 & 1 & 1 & \\ 1 & & & & \\ 1 & & & & \end{bmatrix}$$

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Question : What does (IP) finds for $w=1$?

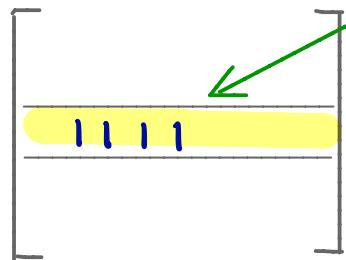
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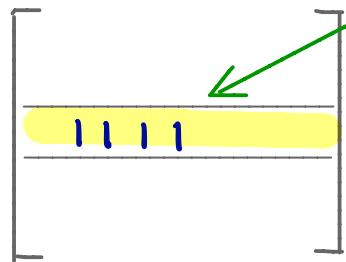
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\implies finds min size st-cut

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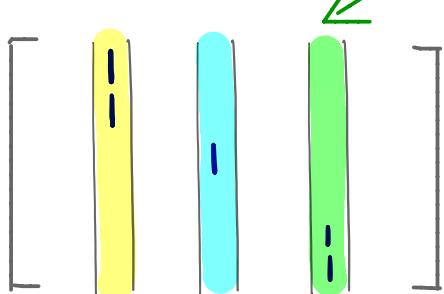
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$$y \leq 1, \quad \begin{array}{l} y \geq 0, y \text{ integer} \\ y \in \Sigma_{0,1\beta}^E \end{array}$$


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Then Menger's theorem



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Exercise :

Show, $Z_{IP} = Z_{ID}$ $\forall w \in \mathbb{Z}_+^n$

What does this say in terms of graphs ?

undirected flows

Three questions

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We saw: Mengerian \Rightarrow Ideal.

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- ideal, why?
- not Mengerian: for $w=1$ we have

$$2 = z_{IP} > z_{ID} = 1$$

No single combinatorial object associated to ideal or Mengerian matrices.

↑
contrast with perfection

Remainder of lectures

Part II : Perfection

Part III : Idealness

Part IV : The Mengerian property