

# Lecture 15

## Plan

- 1) Finish min T-odd cut  
(see Lec 14 notes) ✓
- 2) Matroids.

• Pset 4 deadline extended ~~to~~ to Mon Apr 26

• No OH upcoming Monday evening

# Matroids

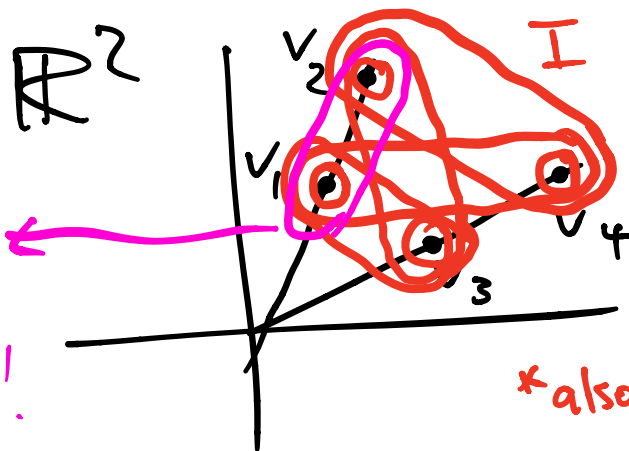
"Tractable" set systems.

E.g. Given vectors  $v_1, \dots, v_m \in \mathbb{R}^n$ ,  
consider set system  $I \subseteq 2^{[m]}$ :

$$I = \left\{ S \subseteq [m] : \{v_i : i \in S\} \text{ linearly independent} \right\}$$

picture:

Not  
in  $I$ !  
"dependent".



\*also  $\emptyset \in I$ .

## Properties of $I$ :

(P1) "Downward closed"

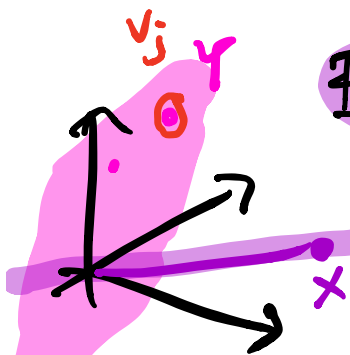
If  $X \subseteq Y$   $Y \in I$ , then  
 $X \in I$ .

(P2) "Exchange property"

If  $X \in I$  and  $Y \in I$  and

$$|Y| > |X|,$$

then  $\exists$  elt. in  $Y$  you can add  
to  $X$  while maintaining indep. of  $X$ .



Formally:  $\exists e \in Y \setminus X$

s.t.  $X \cup \{e\} \in I$ .

$$\uparrow \\ x+e$$

Pf of P2:  $|X| = \dim \text{span} \{v_i : i \in X\}$   
 $|Y| = \dim \text{span} \{v_i : i \in Y\}$ .  
 $\Rightarrow \text{span} \{v_i : i \in X\} \not\subseteq \text{span} \{v_i : i \in Y\}$ .  
 $\Rightarrow \exists j \in Y$  s.t.  $v_j \notin \text{span} \{v_i : i \in X\}$ .  
 $\Rightarrow X + j \in \mathcal{I}$ .  $\square$

P1, P2 capture combinatorial structure of  $\mathcal{I}$ .

for matroids: take P1, P2  
 as axioms.  $\mathcal{I} \subseteq 2^E$ ,  $X$  is maximal in  $\mathcal{I}$   
 if  $\exists$  no  $Y \in \mathcal{I}$  s.t.  $X \subset Y$ .

Def (Matroid) A matroid  $M$  is  
 a pair  $(E, \mathcal{I})$  where

- $E = E(M)$  finite set called ground set of  $M$ .
- $\mathcal{I} = \mathcal{I}(M) \subseteq 2^E$  called independent sets.

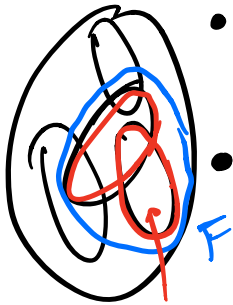
• I satisfies P1 & P2. \* maximum

Remarks • P2  $\Rightarrow$  all maximal (by inclusion) indep sets have same size. (else could increase by P2).



• Maximal independent set called a base of  $M$ .

• dependent := not independent



• for  $F \subseteq E$ , the restriction  $M|_F$   
 $M|_F = \{S \subseteq I : S \subseteq F\}$  is another matroid.

## Examples

• Linear matroid: example from beginning.

AKA "representable"  
 $\rightarrow$

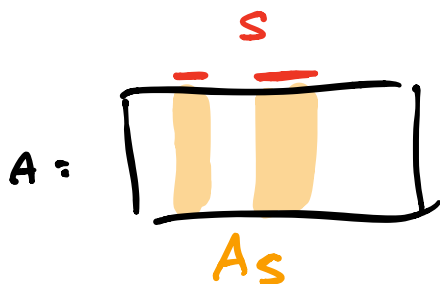
$\triangleright$  equiv def:  $A \in \mathbb{R}^{n \times m}$  matrix,

$I = \left\{ \begin{array}{l} \text{subsets } S \text{ of cols. of } A \\ \text{s.t. submatrix } A_S \end{array} \right\}$

has rank  $A_S = |S|$

$E = \{ \text{set of columns of } A \}$ .  $|E| = n$

e.g.



write  $M = MA$   
if  $M$  comes  
from  $A$ .

▷ This makes sense for  $A \in \mathbb{F}^{n \times m}$   
for any field  $\mathbb{F}$

▷ bases of  $M_A$ : subset  $S$  s.t.  
cols. of  $A_S$  are a basis for  $\mathbb{R}^n$ .

• "boring" example:

uniform matroid:  $U_{n,k} = (E, I)$

where  $|E| = n$

$U_{n,2}$   
complete  
graph  $K_n$

$I = \{ \text{all subsets of } E \text{ of size } \leq k \}$   
 $= \{ S \subseteq E : |S| \leq k \}$ .

$n$  vertices.

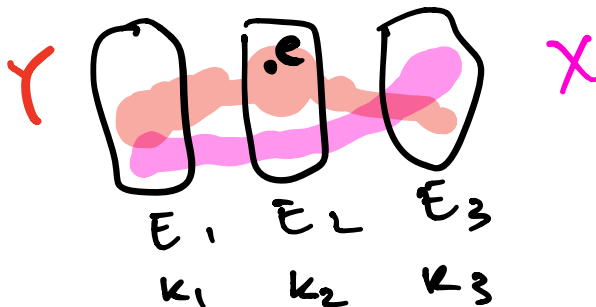
the free matroid is  $U_{n,n} = 2^E$ .

- partition matroid:  $M = (E, \mathcal{I})$   
where  $E$  is disjoint union  $E_1 \dot{\cup} \dots \dot{\cup} E_r$

$$\mathcal{I} = \{X \subseteq E : |X \cap E_i| \leq k_i\}$$

for fixed  $k_1, \dots, k_r$  (parameters).

e.g.

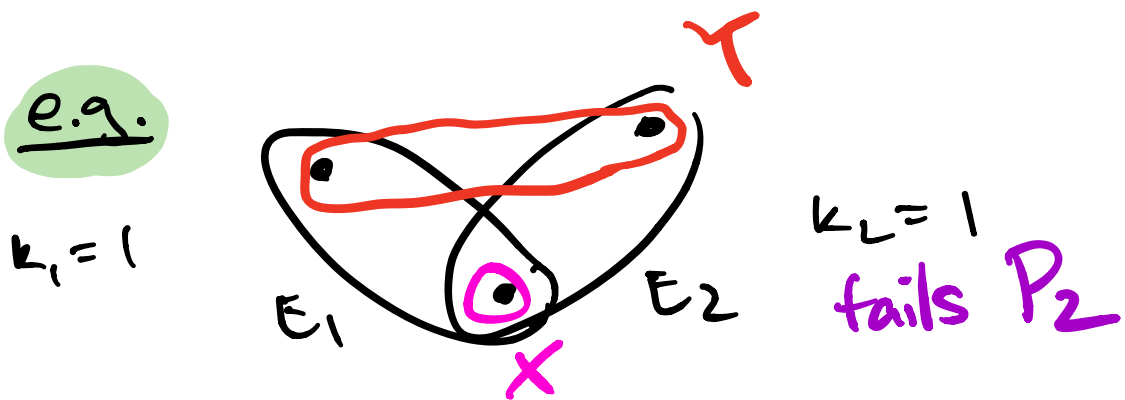


Check P2:

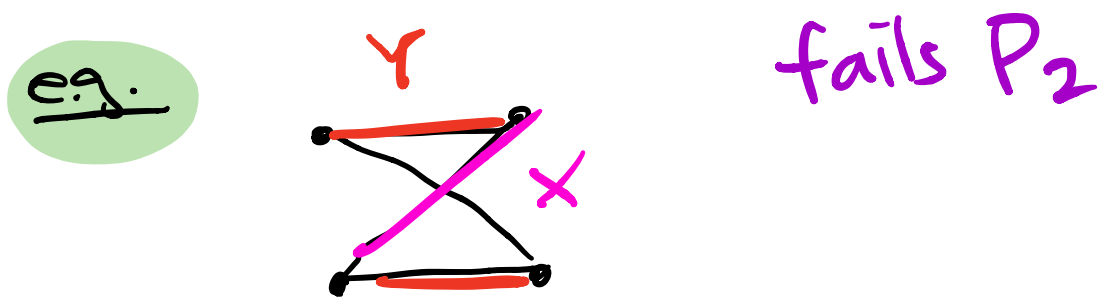
- Let  $|X| < |Y|$ ,  $X, Y \in \mathcal{I}$ .
- $\exists i$  s.t.  $|Y \cap E_i| > |X \cap E_i|$   
 $k_i \neq$

- $\Rightarrow$  for any  $e \in Y \cap E_i \setminus X \cap E_i$ :  
 $X + e$  independent.

Remark: if  $E_i$  not disjoint:



- Another Nonexample: set of matchings in a graph.





• graphic matroids:

Given graph  $G=(V, E)$ , *undirected*

Let  $M(G) = (E, \mathcal{I})$  where

$$\mathcal{I} = \{ \text{forests in } G \}$$

$$= \{ \text{acyclic subgraphs of } G \}.$$

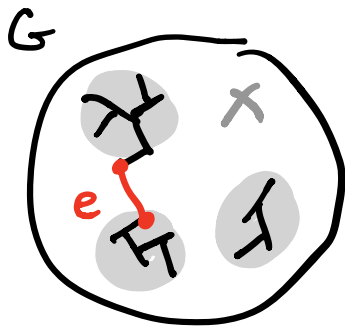
e.g.  $G = \triangle$

$$\mathcal{I} = \left\{ \begin{array}{ccc} \text{---} & \text{---} & \text{---} \\ \diagup & \diagdown & \diagup \\ \cdot & \cdot & \cdot \\ \text{---} & \text{---} & \text{---} \\ \cdot & \cdot & \cdot \\ \text{---} & \text{---} & \text{---} \\ \cdot & \cdot & \cdot \\ \vdots & & \cdot \\ \cdot & \cdot & \cdot \\ \vdots & & \cdot \end{array} \right\}$$

## Checking P2:

- $F$  forest  $\Rightarrow |V| - |F| = \overset{\text{\# edges}}{\downarrow} \overset{\text{\# connected}}{\uparrow} \text{Components}$   $\overset{\text{C.C.'s}}{\uparrow}$
- $X, Y$  forests,  $|X| < |Y| \Rightarrow Y$  has fewer C.C.'s.

$\Rightarrow$  some edge  $e$  of  $Y$  connects two C.C.'s of  $X$

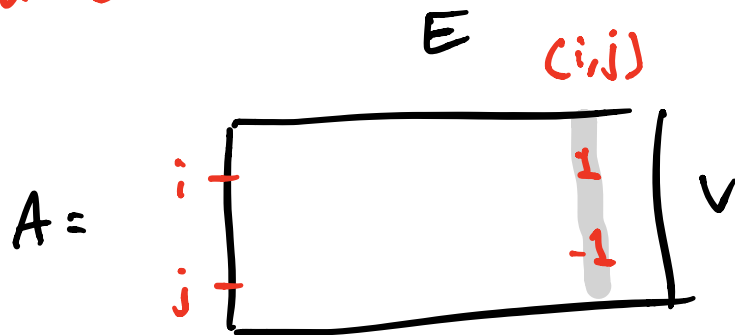


$\Rightarrow X + e$  larger forest.

$\triangleright$  bases: the spanning trees.  
(all have  $n-1$  edges).

$\triangleright$  graphic  $\Rightarrow$  linear:

P.F.:  $M(G) = M_A$  where  $A$  directed  
~~matrix~~ vertex-edge incidence matrix  
 (direct arbitrarily).



Ex. Check: subset of cols. is lin. indep  
 $\Leftrightarrow$  subgraph contains no cycle.  $\square$

$\triangleright$  Graphic  $\Rightarrow$  regular:

Say  $M$  regular if  $M$  is linear  
 over every field  $F$ .

$-1$  in  $A \leftarrow$  additive inverse of  $1$  in  $F$ .

Note:  $A$  above is T.U.

Fact: matroid  $M$  regular  $\Leftrightarrow$   
 $M = M_A$  (over  $\mathbb{R}$ ) for T.U. matrix  $A$ .

# Circuits

by inclusion.



- Circuit! = minimal dependent set.  
(i.e.  $\perp$  circuit  $\Rightarrow$   $\perp$ -e independent).

e.g.  $\triangleright$  in graphic matroid: circuits are the cycles.

$\triangleright$  in partition matroid, circuits are just subsets  $C \subseteq E_i$  with  $|C| = k+1$ .

e.g.



Note:

$\perp$  circuit  $\Rightarrow$   $\perp$ -e independent

There's exactly one way to do the reverse!

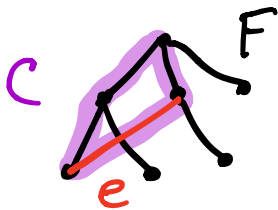
Theorem (unique circuit property)

▷ let  $M = (E, I)$  matroid.

▷ let  $S \in I, e \in E$  st.  $S + e \notin I$

▷ Then:  $\exists$  a unique circuit  
 $C \subseteq S + e.$

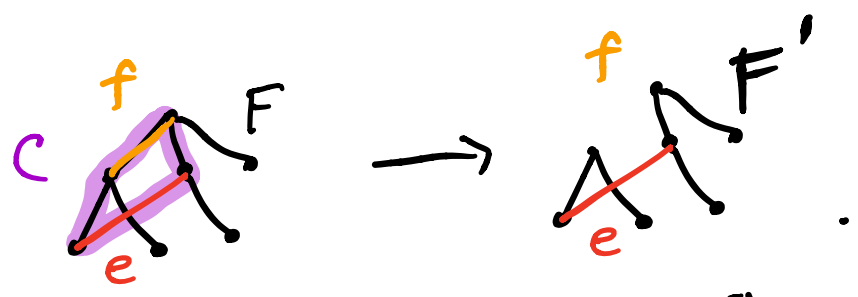
e.g. If  $F$  is a forest,  $F + e$  is not:



Remark: uniqueness shows

how to make more independent sets:  
 sets: Let  $C \subseteq S+e$  circuit,  $f \in C \setminus e$   
 then  $S+e-f \in \mathcal{I}$ .

e.g.



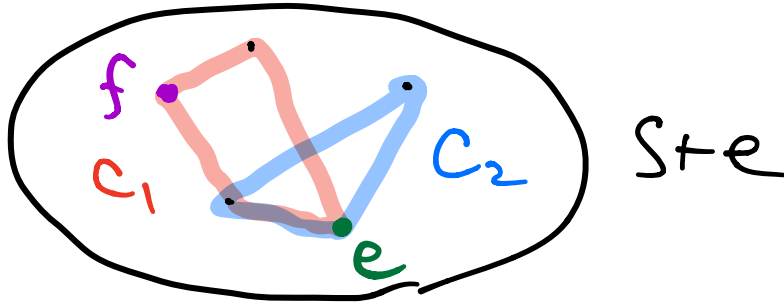
Pf: Else,  $S+e-f$  contains circuit  $C' \neq C$   
 (and hence  $S+e$ ).

Proof of UCP:

- suppose  $S+e$  contains distinct circuits  $C_1 \neq C_2$ . *was typo in class. :/*
- Minimality  $\Rightarrow C_1 \not\subseteq C_2 \Rightarrow \exists f \in C_1 \setminus C_2$ .

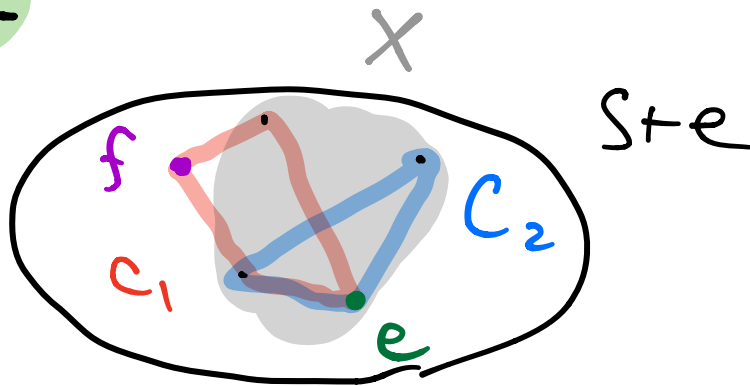
Note:  $C_2 \subseteq S+e-f$ .

▷ We'll show  $S+e-f \in I$ ;  
 Contradicts  $C_2 \subseteq S+e-f$ . (bc  $C_2$  dependent, P1).



- $C_1 - f$  independent  $\Rightarrow C_1 - f$  to  
 (by minimality) maximal indep.  $X$   
 Subject to  $X \subseteq S+e$ .

e.g.



or  $M/S+e$   
 is matroid

- Both  $S, X$  maximal independent  
 within  $S+e \Rightarrow |X| = |S|$  by P2.

•  $e \in X \Rightarrow$  because  $e \in C, -f \in X$   
 $\Rightarrow X = S + e - f.$

•  $\Rightarrow S + e - f$  indep, contradiction.  $\square$

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$M = (E, I)$  e.g. could have  $E =$  edge set of  $G$   
(review P1, P2 from earlier).  $I =$  forests in  $G$ .

## Matroid optimization

• Given cost function  $c: E \rightarrow \mathbb{R}$ ,  
want indep. set  $S$  of max. cost

$$c(S) = \sum_{e \in S} c(e).$$

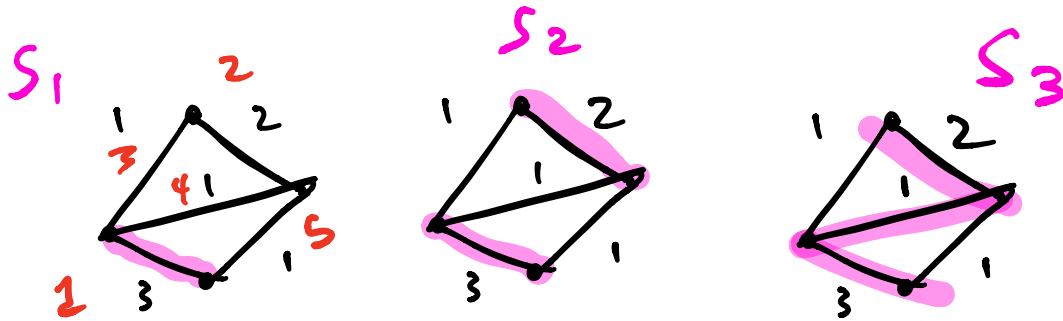
• This problem is tractable,  
one reason matroids are  
important.



- if some  $c(e) < 0$ : can restrict to  $M \mid E - e$ . (removing  $e$  from  $S \in \mathcal{I}$  increases cost).
- if  $c \geq 0$ : need only optimize over bases.

e.g. for graphic matroids:  
 on connected graphs  
 this is the maximum spanning  
 tree problem (MST).

Recall: M.S.T. has simple  
greedy algorithm: keep adding  
 largest element that doesn't  
 create a cycle.



## Kruskal's algorithm

- Fact: greedy algo works for any matroid.
- Actually, for all  $k$ : greedy outputs indep set of size  $k$  of max cost.  $S_k$

Algorithm Let  $|E| = m$ .

▷ Sort  $E$  by cost:  $c(e_1) \geq c(e_2) \dots \geq c(e_m)$

▷  $S_0 := \emptyset, k = 0$

▷ For  $j=1$  to  $m$ :

▷ if  $S_k + e_j \in I$  then:

▷  $S_{k+1} := S_k + e_j$

▷  $k \leftarrow k+1$ .

▷ Output  $S_1, \dots, S_k$ .

Thm: For any matroid  $M = (E, I)$ ,  
above alg. finds indep. set  $S_k$   
such that

$$c(S_k) = \max_{\substack{|S|=k \\ S \in I}} c(S).$$

Proof: Suppose not.

- Let  $S_k = \{s_1, \dots, s_k\}$  with  $c(s_1) \geq \dots \geq c(s_k)$ .
- Suppose  $T_k = \{t_1, \dots, t_k\}$   
 $c(t_1) \geq c(t_2) \dots \geq c(t_k)$   
s.t.  $c(T_k) > c(S_k)$ .
- Let  $p :=$  first index where  $c(t_p) > c(s_p)$ .
- Let  $A = \{t_1, \dots, t_p\}$   
 $B = S_{p-1} = \{s_1, \dots, s_{p-1}\}$ .

•  $|A| > |B| \Rightarrow \exists t_i \in A \setminus B$  s.t.  
 $B + t_i \in I$  (by P1).

• But  $c(t_i) \geq c(t_p) > c(\Delta_p)$   
 $\Rightarrow c(t_i) > c(\Delta_p)$   
 $\Rightarrow t_i$  should have been  
added to  $S_{p-1}$  instead of  
 $\Delta_p$ . ~~XXX~~ □

To get global

max

min-cost independent set:

In greedy alg,

Replace for  $j=1 \dots m$

for  $j = 1 \dots q$

~~if~~  $e_j$  is last  
nonnegative element.