

CSC791/495-011

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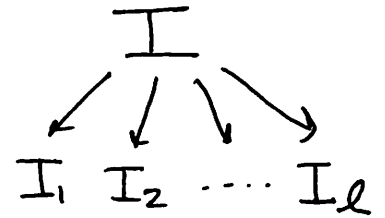
September 1, 2017

# Bounded Search Trees

Idea: Build a feasible soln through a sequence of decisions, each of which investigates options.

\* Argue that your strategy guarantees yes-instance  $\Rightarrow$  some sequence considered yields feas. soln.

Key requirements: ①  $l \leq \mu(I)$

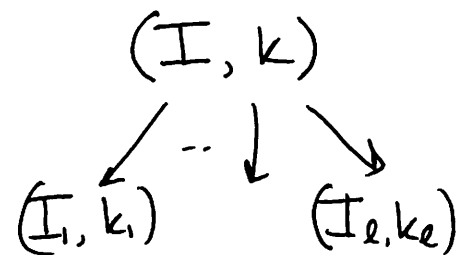


②  $\mu(I_j) \leq \mu(I) - c$ ,  $c$  constant  $\geq 1$

③ every feasible soln to an  $I_j$  yields one for  $I$   
and the set of feasible solns for  $\{I_j\}_{j=1}^l$  contains at least one (optimum) soln for  $I$ .

To use this for an FPT algorithm: (a) ② (depth of tree)  $\leq f(k)$   
must have  ~~$l \leq f(k)$~~

(b) each branch step (& eval. @ leaves)  
must run in poly-time (in  $|I|$ )



Typical Strategy: Figure out a set  $S$  so that some element of  $S$  is in every optimal soln.

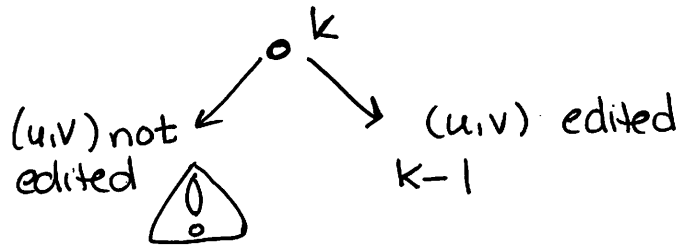
# Cluster Editing, Take 2

Recall we gave an  $O(k^2)$ -vertex kernel for Cluster Editing  $\Rightarrow O\left(\binom{k^2}{k} \cdot n^{O(1)}\right)$  algorithm.

What does the branching algorithm based on our  $P_3$  observation yield?

What set  $S$  of things must have at least one occur in every feasible solution?  
pairs of vertices edit edge

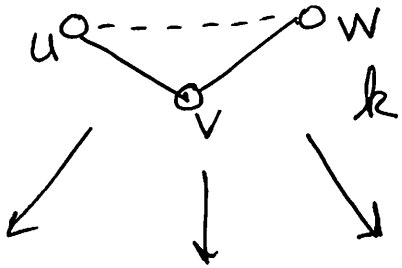
Suggestion pick  $(u, v)$



Try Again break up/complete a  $P_3$ .

Q: can we find an induced  $\overline{P_3}$  in poly-time?

YES:  $n^3$

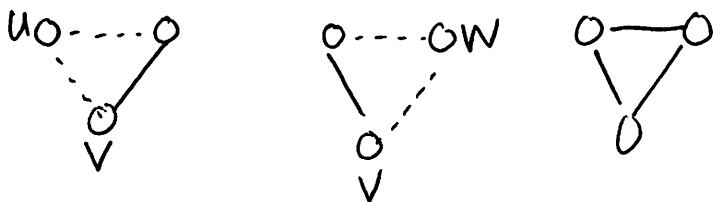


### 3 ways to "resolve"

B1 delete uv

B2 delete vw

B3 add uw

$$\left\{ \begin{array}{l} \text{all } k \rightarrow k-1 \end{array} \right.$$


stopping criteria: no  $P_3$ 's left yes if  $k \geq 0$   
if  $k = 0 \Rightarrow$  say NO when  $P_3$  exists.

Running time:  $O(3^k) \cdot n^3$

[illegible]

# Min-Ones-r-SAT

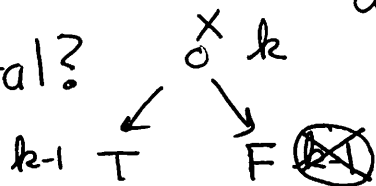
Problem Given an  $r$ -CNF formula  $\varphi$  and  $k \in \mathbb{Z}^+$ , is there a satisfying assignment for  $\varphi$  with at most  $k$  variables set to TRUE?

[sidebar: CNF = conjunctive normal form  $(a \vee b \vee \neg c) \wedge (d \vee c) \wedge (\neg b)$ ;  $r$ -CNF  $\Rightarrow$   $r$  literals per clause]

Treat  $r$  as fixed constant.

Goal: check if some subset of  $\leq k$  literals satisfies all clauses (if set to TRUE)

Idea: branch on a literal?



same issue.

Observation every clause must be satisfied  $\Rightarrow$  maybe we can pick a literal to set true from the clause.

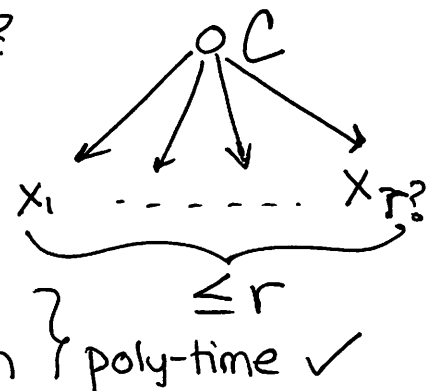
Q: can we set all  $r$  to TRUE & satisfy  $C$ ?

NO so restrict your attention to the positive literals in  $C$

branch into  $\leq r$   
subproblems w/ 1 less  
clause & 1 less TRUE available.

{ If  $k=0$  & unsatisfied clause  $\Rightarrow$  NO  
If no unsatisfied clause  $\Rightarrow$  YES

Key information: start w/ all literals FALSE.



\* pick an unsatisfied clause to branch on

$$O(r^k) \cdot n^{O(1)} \\ f(k) \cdot n^c$$

FPT ✓

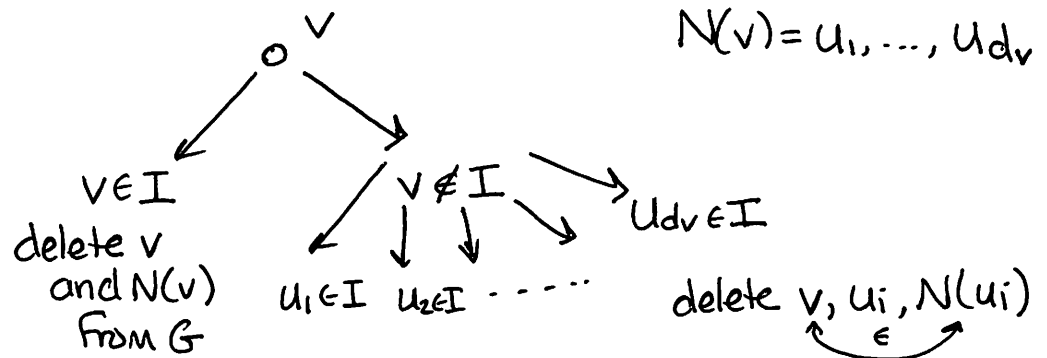
# In-Class Exercise

Problem Given a graph  $G$  and  $k \in \mathbb{Z}^+$  does  $G$  contain a set of  $k$  vertices that are pairwise non-adjacent (an independent set).

Thm  $k$ -Independent Set is FPT on graphs of max degree  $d$  (a constant).

Prove this using a branching algorithm! Give the overall running time of your approach.

Algorithm branching rule:  
pick a vertex  $v$   
& branch on which of  $\underbrace{v \cup N(v)}_S$   
is in the indep. set.



Why is this "safe"? Every maximal indep. set contains  $\geq 1$  of  $S$ ?  
If none of  $N(v)$  are in  $I \Rightarrow$  we can add  $v$  for free, making it bigger.

stopping criteria:  $k=0 \Rightarrow \text{YES}$

$G$  has no vertices (&  $k > 0$ )  $\Rightarrow \text{NO}$ .

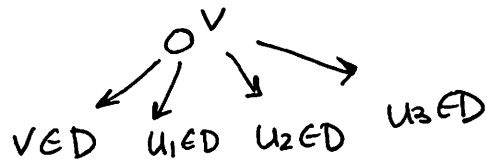
run-time:  $\underbrace{O(d^k) \cdot n}_{\text{not quite}} \leq d \Rightarrow O((d+1)^k) \cdot n$   
b/c # branches =  $|N(v)| + 1$

# Domination

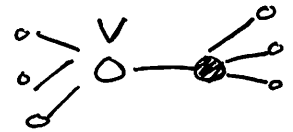
Problem Given a graph  $G$  and  $k \in \mathbb{Z}^+$ , is there a set of at most  $k$  vertices in  $G$  s.t. every vertex is either in the set or has a neighbor in the set?  
(does  $G$  have a dominating set of size  $\leq k$ ?)

Thm  $k$ -DominatingSet is FPT in graphs of max degree 3.

Idea pick a vertex  $\Rightarrow$  either  $v$  must be in  $D$  or one of its neighbors is in  $D$ .



can we delete  $v$  from subproblems?  $\checkmark$   
What about  $N(v)$ ? can't be sure  
they're not needed in dom.set.



problem: look at  $(G \setminus \{v\}, k-1)$ . Still have to dominate all vertices. Problem is that  $N(v)$  was already dominated, so this might be a no-instance when original was a yes.

solution remember which vertices are already dominated - add labels.  $U_n \notin \text{Dom}$  to every vertex. Now solve: Given labelled  $G$  is there a set  $\hat{S}$  of  $\leq k$  vertices s.t. every vertex labelled  $U_n$  is in  $S$  or adjacent to a member of  $S$ ?

## Domination, cont

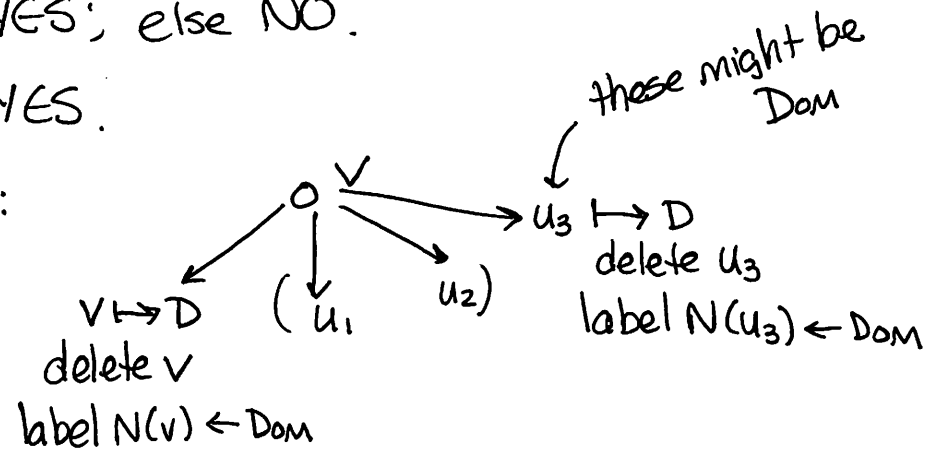
Initialization  $f(v) = \text{Un } \forall v$

Algorithm Given  $G + f: V \rightarrow \{\text{Un}, \text{Dom}\}$ ,  $k \in \mathbb{Z}^+$

1. If  $k=0 \Rightarrow$  If all labels are Dom  $\Rightarrow \text{YES}$ ; else NO.
2.  $k \geq 0 \Rightarrow$  If all labels are Dom  $\Rightarrow \text{YES}$ .
3. pick an undominated vertex & branch:

note:  $k \rightarrow k-1$  in all branches.

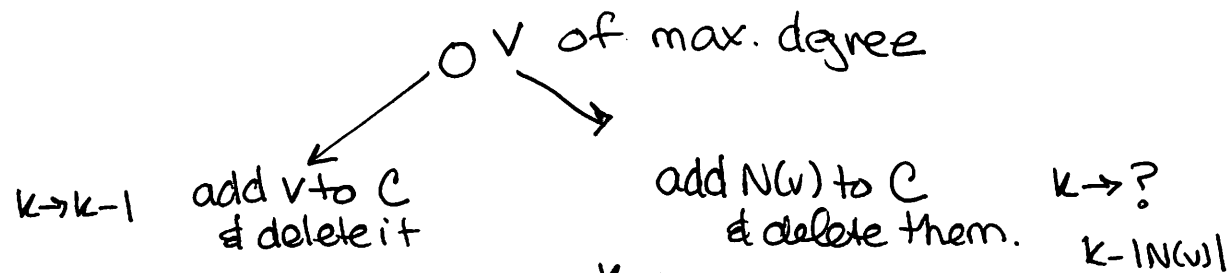
running time:  $O(4^k) \cdot n$



# Vertex Cover, revisited

## Naïve branching:

At every vertex, either  $v \in \text{cover}$  or  $N(v) \subseteq \text{cover}$



stopping criterion: add (max degree 1  $\Rightarrow$  solve w/ BF) <sup>rule</sup> <sub>price</sub>

$k \rightarrow k - |N(v)|$   
only better if  $|N(v)| \geq 1$

$$O(2^k) n^{O(1)}$$

## Can we do better?

this is sloppy analysis

$T(k) = \# \text{ leaves in a tree w/ param } k.$

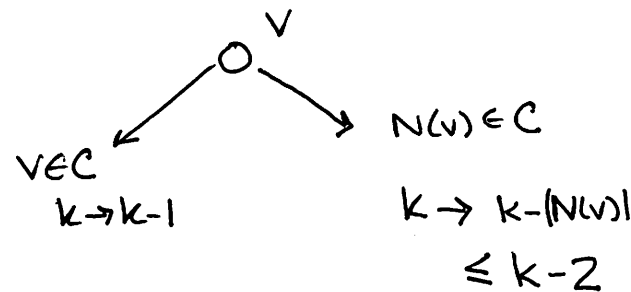
$$T(k) = T(k-1) + T(k-2) \quad \&$$

$$T(i) = \begin{cases} T(i-1) + T(i-2) & i \geq 2 \\ 1 & i = 1 \end{cases}$$

Claim:  $T(k) \leq 1.6181^k$  How would you prove it? Induction

$\left(\frac{1+\sqrt{5}}{2}\right)^k$  where did this come? Want upper bound  $c \cdot \lambda^k$

$$c \cdot \lambda^k \geq c \cdot \lambda^{k-1} + c \cdot \lambda^{k-2} \Rightarrow \lambda^2 \geq \lambda + 1$$





# Recurrence Relations

Solve for bounds on size of search tree using recurrences. Ours will have a (very) nice form — linear recurrences w/ constant coefficients.

$$T(k) = T(k-d_1) + T(k-d_2) + \dots + T(k-d_r) \quad \begin{array}{l} \nearrow \\ \text{\# leaves} \end{array} \quad \begin{array}{l} r = \# \\ \text{branches} \end{array}$$

Solution to this is characterized by branching vector  $(d_1, \dots, d_r)$

# branching # (base of your  $\alpha^k$  runtime) is the  $\sqrt[r]{\text{largest}}$

the characteristic polynomial

$$\lambda^d + \lambda^{d-d_1} + \dots + \lambda^{d-d_r}$$

$$d = \max\{d_1, \dots, d_r\}$$

In vertex cover we had vector  $(1, 2)$  &  $\alpha = 1.61\dots$

$\uparrow$  solved char poly. using quadratic formula

# Branching Vectors (# Numbers)

(i, j)	1	2	3	4	5
1	2.0000	1.6181	1.4656	1.3803	1.3248
2		1.4143	1.3248	1.2721	1.2366
3			1.2560	1.2208	1.1939
4				1.1893	1.1674
5					1.1487

(l, i, j)	1	2	3	4
1	3.0000	2.4142	2.2056	2.1069
2	2.4142	2.0000	1.8929	1.7549

# Cluster Editing (third time's the charm?)

$[(1, 2, 3, 3, 2)]$

Design an improved branching strategy for Cluster Editing.

Consider an induced  $P_3$ :  $u \text{---} v \text{---} w$ . Before, we had 3 cases:

B1:  $-(u, v)$

B2:  $-(v, w)$

B3:  $+(u, w)$

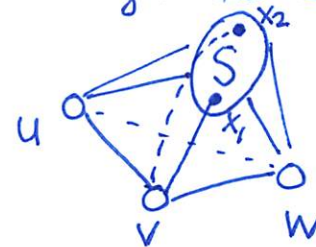
Let's look at structure more closely. Consider  $S = (N(u) \cap N(w)) \setminus \{v\}$  (other mutual neighbors of  $u, w$ ).  
(why? b/c they will also give induced  $P_3$ 's in many cases)

There are 3 cases:

C1:  $S = \emptyset$

C2:  $\exists x_1 \in S$  s.t.  $(x_1, v)$  is an edge

C3:  $\exists x_2 \in S$  s.t.  $(x_2, v)$  is a non-edge



To do better branching in each case, we'll keep some extra info around (like in DomSet).

Let's annotate each vertex  $v$  w/ a label  $\tau(x, y) \in \{\emptyset, P, F\}$  for  $(x, y)$  pair.  $\emptyset$ : unlabelled/no info;  $P$ : permanent/edge which cannot be removed;  $F$ : forbidden/non-edge which cannot be added.

and apply a "reduction rule" anytime  $\tau$  gets updated

so that  $\tau(u, v) = \tau(u, w) = P \Rightarrow \tau(v, w) = P$  (only way to resolve  $P_3$ )

and  $\tau(u, v) = P + \tau(u, w) = F \Rightarrow \tau(v, w) = F$  (similarly).

Case C1: Just branch into cases B1 & B2. You need to prove that B3 cannot provide a better solution in this case (Lemma).

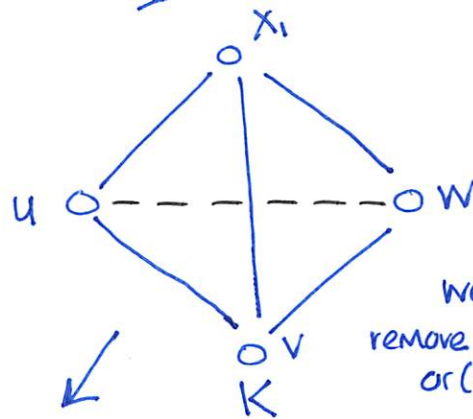
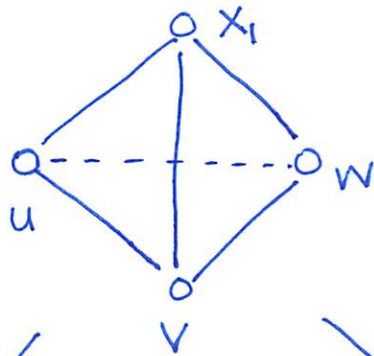
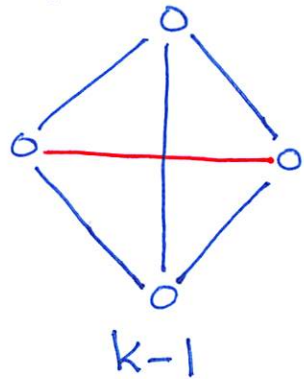
branching vector:  $(1, 1) \Rightarrow$  branching # 2.0

# CE III (Runtime Analysis) 🔴 On your own: work out case C3 to get (1,2,3,3,2)

Case C2:

first, let's branch on "edge"  $(u, w)$

all visible  $P_3$ 's resolved.

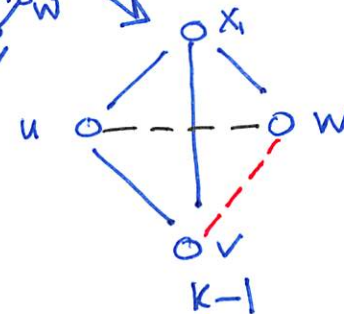


—  $P$  & added

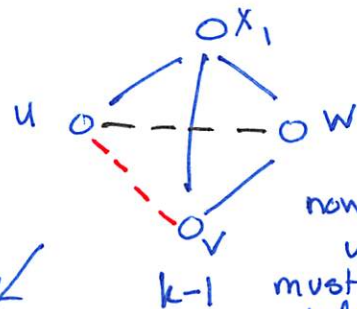
- - -  $F$  & deleted

—  $P$   
- - -  $F$  } these will apply to enforce our branch conditions & as a result of  $\Uparrow$  reduction rules.

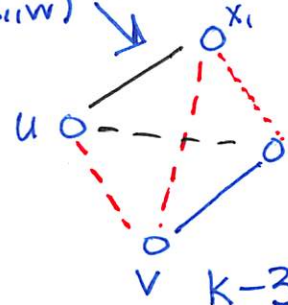
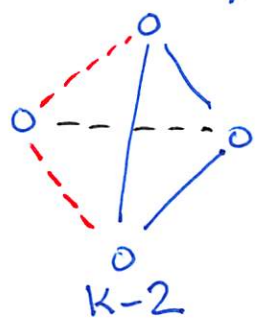
we should MUST remove either  $(u, v)$  or  $(v, w)$  to resolve



two more cases ( $k-2, k-3$ ) as in removing  $(u, v)$ .



now  $\begin{matrix} x_1 \\ \swarrow \quad \searrow \\ u \quad w \end{matrix}$  must be resolved by deleting either  $(u, x_1)$  or  $(x_1, w)$



$(u, x_1)$  is  $P$  b/c of branching  
here,  $\Uparrow$  rule  $\Rightarrow (x_1, v) \rightarrow F$

C2 branch vector  
 $(1, 2, 3, 2, 3) \Rightarrow$   
branch # 2.27

# Today's Problems

① Give a  $2^k n^{O(1)}$  algorithm for Min-2-SAT using branching.

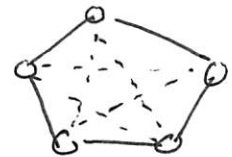
Min-2-SAT: Given a 2-CNF formula  $\varphi$  and  $k \in \mathbb{Z}^+$ , is there an assignment for  $\varphi$  that satisfies at most  $k$  clauses?

This week's proof write-up!

② Defn a graph  $G$  is chordal if it does not contain an induced cycle of length  $> 3$ .

Chordal Completion Given a graph  $G$  and  $k \in \mathbb{Z}^+$ , can you add at most  $k$  edges to  $G$  to obtain a chordal graph?

\* Give an FPT branching algorithm for chordal completion.



Helpful Lemma At least  $k-3$  edges are needed to make a  $k$ -cycle chordal.



# OCT perfection

Bonus Problem 😊

Defn a graph is perfect if for every induced subgraph, the clique number is equal to the chromatic number.

Problem Given a graph  $G$  and  $k \in \mathbb{Z}$  is there a set  $X$  of at most  $k$  vertices so that  $G \setminus X$  is bipartite?

Odd Cycle Transversal

Thm  $k$ -OCT has a  $3^k n^{O(1)}$  branching algorithm in perfect graphs.