

Recall from L10:

L-reduction:

$$\begin{array}{ccc} A & \xrightarrow{\quad} & B \\ x & \xrightarrow{f} & x' = f(x) \\ & & \vdots \\ g(x, y') & = & x' \xleftarrow{g} y' \end{array}$$

$$\xrightarrow{\leq \alpha}$$

$$① \text{OPT}_B(x') = O(\text{OPT}_A(x))$$

$$② |\text{cost}_A(y) - \text{OPT}_A(x)| = O(|\text{cost}_B(y') - \text{OPT}_B(x')|)$$

[Papadimitriou & Yannakakis - JCSS 1991]

$\Rightarrow$  PTAS-reduction

- for minimization:  $S(\varepsilon) = \varepsilon / \alpha \beta$  (AP-reduction)

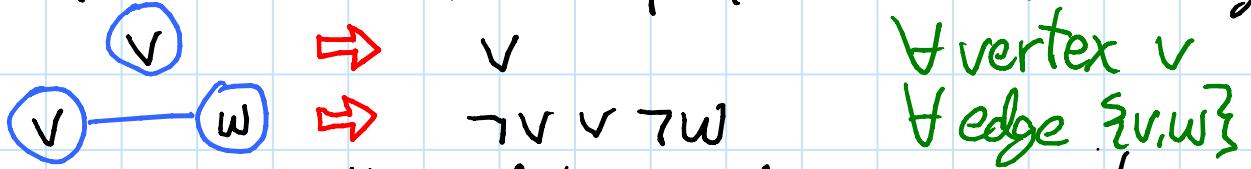
APX-complete problems so far:

- Max E3SAT-E5
  - Max 3SAT-3
  - Independent set
  - Vertex cover
  - Dominating set
- } bounded degree

## Max 2SAT:

[Papadimitriou & Yannakakis - JCSS 1991]

- L-reduction from Independent set, bounded deg.



- never worth violating edge constraint:  
could violate either vertex at same cost
- $\Rightarrow$  solution gives an indep. set
- $\Rightarrow \text{OPT}_{2\text{SAT}} = \underbrace{\text{OPT}_{\text{IS}}}_{\Theta(|V|)} + \underbrace{\#\text{edges}}_{\Theta(|V|)} - \text{bounded degree}$

## Max E2SAT-E3 $\rightarrow$ [Berman & Karpinski - ICALP 1999]

## Max NAE 3SAT:

[Papadimitriou & Yannakakis - JCSS 1991]

- strict-reduction from Max 2SAT

$$x \vee y \quad \Rightarrow \quad \text{NAE}(x, y, a)$$

$\models$  Same in all clauses

- by flipping, can assume  $a = \emptyset$

- score = #  $(x, y)$ s where  $x$  or  $y = 1$

## Max cut:

[Papadimitriou & Yannakakis - JCSS 1991]

= max positive 1-in-2SAT

= max positive XOR-SAT

- L-reduction from Max NAE 3SAT:

- clause gadget: 2 points if satisfied, 0 else

- variable gadget: never hurts to put  $x_i$  &  $\bar{x}_i$  in opposite sides

$$\Rightarrow \text{OPT}_{\text{cut}} = 2 \cdot \left( \sum_i \# \text{occurrences of } x_i \rightarrow \leq 3 \cdot \# \text{clauses} \right. \\ \left. + \# \text{satisfied clauses} \right)$$

$$= \Theta(\text{OPT}_{\text{NAE}}) \rightarrow \geq \frac{1}{2} \# \text{clauses}$$

- degree-3 possible

$\leq \max \mathbb{Z}_2\text{-LIN-}\mathbb{Z}_2\text{-3}$

$\downarrow$   
= 2 literals/eqn.

[Berman & Karpinski

- ICALP 1999]

$\underbrace{\quad}_{\text{linear eqns. over } \mathbb{Z}_2}$  ↳ 3 eqns./variable

## Max/min CSP / Ones:

# clauses  $\downarrow$  # true variables  $\downarrow$

[Khanna, Sudan, Trevisan,  
Williamson – SICOMP 2001]

- analog to Schaefer Dichotomy
- given allowable clause functions
- instance can be weighted or not
- e.g.: Max 2SAT = Max CSP( $x_1 \vee x_2, \bar{x}_1 \vee x_2, x_1 \vee \bar{x}_2, \bar{x}_1 \vee \bar{x}_2$ )  
 Max Cut = Max CSP( $x_1 \oplus x_2$ )  
 Max Clique = Max Ones( $x_1 \text{ NAND } x_2$ )
- Max CSP
  - EPO if setting all vars. false or all vars. true satisfies all clause types
  - EPO if all clauses in DNF have 2 terms, one all positive & one all negative
  - APX-complete otherwise
- Max Ones:
  - EPO if setting all vars. true satisfies all
  - EPO if CNF of Dual-Horn subclauses ( $\leq 1$  negated)
  - EPO if  $\leq 2$ -X(N)OR-SAT: linear eqns., 2 terms, over  $\mathbb{Z}_2$
  - APX-complete if  $\leq 3$ (N)OR-SAT (not 2-)
  - Poly-APX-complete if CNF of Horn subclauses
  - Poly-APX-complete if 2CNF
  - Poly-APX-complete if setting all or all but one variable false satisfies each constraint
  - 0 vs.  $>0$  NP-hard if setting all vars. false satisfies
  - feasibility NP-hard if none of above (& not previous case)

- Min CSP:
  - EPO if setting all vars. false or all vars. true satisfies all clause types
  - EPO if all clauses in DNF have 2 terms, one all positive & one all negative
  - APX-complete if  $\text{OR}(\text{O}(1) \text{ variables})$ ,  $\neg x_1 \vee x_2$
  - $\text{O}(1)$ -hitting set implication
  - Min Uncut-complete if  $\leq 2\text{-X}(N)\text{OR-SAT}$
  - $\text{Min CSP}(\text{XOR})$  - APX-hard &  $\text{O}(\log n)$ -approx.
  - Min 2CNF-Deletion-complete if 2CNF
  - $\text{Min CSP}(\text{OR, NAND})$  - APX-hard &  $\Omega(\log n \log \log n)$ -apx.
  - Nearest Codeword-complete if  $\leq \text{X}(N)\text{OR-SAT}$  (not 2-)
    - $\text{Min CSP}(\bar{x}_1 \oplus x_2 \oplus x_3, \bar{x}_1 \oplus x_2 \oplus x_3)$  -  $\Omega(2^{\log^{1-\varepsilon} n})$ -inapprox.
  - Min Horn Deletion-complete if Horn or Dual-Horn
    - $\text{Min CSP}(\bar{x}_1 \vee x_2 \vee x_3)$  -  $\Omega(2^{\log^{1-\varepsilon} n})$ -inapprox., EPoly-APX
  - $\text{O}$  vs.  $>\text{O}$  is NP-complete otherwise
- Min Ones:
  - EPO if setting all vars. false satisfies all
  - EPO if CNF of Horn subclauses ( $\leq 1$  positive)
  - EPO if  $\leq 2\text{-X}(N)\text{OR-SAT}$
  - APX-complete if 2CNF
  - APX-complete if  $\text{O}(1)$  hitting set + implication
  - Nearest Codeword-complete if  $\leq \text{X}(N)\text{OR-SAT}$  (not 2-)
  - Min Horn Deletion-complete if CNF of Dual-Horn
  - Poly-APX-complete if all vars. true satisfies - if weighted:
  - feasibility NP-hard otherwise hard to approximate by any factor

## Another APX-completeness series:

Max. independent set in 3-regular  
3-edge-colorable graphs

[Chlebík &  
Chlebíková -  
CIAC 2003]

Max. 3DM-E2:

- given triples  $\subseteq A \times B \times C$
- solution = subset of triples  
not repeating any item  $\in A \cup B \cup C$
- each item appears  $\leq$  twice
- strict-reduction from previous problem:
  - edge color classes  $\rightarrow A, B, C$
  - vertex  $\rightarrow$  triple

Max. edge matching puzzles: [Antoniadis & Lingas -  
SOFSEM 2010]  
- goal: maximize # matching edges

- $\in \text{APX}$  (max. matching gives  $\geq n/8$  matches)
- L-reduction from previous problem
  - $2 \times n$

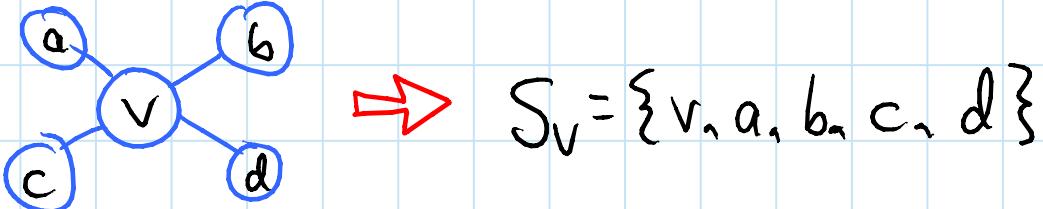
$\Theta(1)$ -approximable ( $\in \text{APX} \setminus \text{PTAS}$ ) but  
not APX-complete: [Crescenzi, Kann, Silvestri, Trevisan -  
(unless polynomial hierarchy collapses) SICOMP 1999]  
PH

Bin packing: given  $n$  numbers & bin size  $B$ ,  
min. # bins to store the numbers  
- has asymptotic PTAS (+1 additive error)

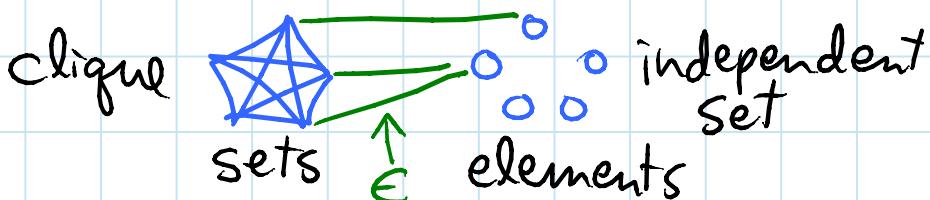
Min. max.-degree spanning tree  
Min. edge coloring

- Log-APX-complete: (A-reductions:  $\gamma^1 c\text{-approx.} \Rightarrow \gamma O(c)\text{-approx.}$ )
- set cover
  - dominating set [Escoffier & Paschos - TCS 2006]

- strict-reduction from dom. set to set cover:



- strict-reduction from set cover to dom. set:



- never need to choose element: take a set  $\Rightarrow$

Token reconfiguration: [Calinescu, Dumitrescu, Pach - LATIN 2006]

- given initial & goal token placements
- move = slide pebble along empty path
- goal: min. # moves
- APX-hard for unlabeled & labeled tokens
  - L-reductions from Set Cover
- 3-approx. for unlabeled

- motivation:  $15 = n^2 - 1$  puzzle
 

- NP-hard &  $\epsilon$ APX [Rahner & Warmuth 1990]

Poly-APX-complete: max. independent set  
& max clique (complement)  
(PTAS-reductions) [Bazgan, Escoffier, Paschos - TCS 2005]

Exp-APX-complete: nonmetric Traveling salesman  
 $\hookrightarrow 2^{n^{O(1)}}$  [Escoffier & Paschos - TCS 2006]

## NPO-complete: THE HARDEST! (AP-reductions)

[Crescenzi, Kann, Silvestri, Trevisan - SIcomp 1999]

### Max./min. weighted SAT (AKA "ones")

- given CNF formula
- given nonneg. weight  $w_i$  of each var.  $x_i$
- Solution = satisfying assignment (NP-hard!)
- cost =  $\sum_i w_i x_i$  (can max with 1)

### Max/min 0-1 linear programming:

- given integer matrix  $A$ , vectors  $b$  &  $c$
- max/min  $c \cdot \text{X} \rightarrow$  0-1 vector  
subject to  $Ax \geq b$

### NPO PB-complete: above with integer $\rightarrow \{0, 1\}$ (or poly. bounded integer)

- $n^{1-\epsilon}$ -inapproximable even with trivial solutions

[Jonsson - IPL 1998]

- min. independent dominating set  $\leftarrow$  [Kann - NJC 1994]
- shortest computation in nondet. Turing machine
- longest induced path  $\leftarrow$  [Berman & Schnitger - I&C 1992]
- longest path with forbidden pairs

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## 6.890 Algorithmic Lower Bounds: Fun with Hardness Proofs

Fall 2014

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