

Hardness of Approximation II Simon Cheng

- ① Unique games conjecture
- ② Review: Goemans-Williamson for MAX-CUT
- ③ UG Hardness of MAX-CUT $\arccos \frac{p}{\pi} + \epsilon, \frac{1-p}{2} - \epsilon$
 - reduction
 - completeness

last lecture: decision problem for MAX-E3LIN
 $\leq \frac{1}{2} + \epsilon$ vs $\geq 1 - \delta$ is NP-Hard

notation: MAX-E3LIN $\frac{1}{2} + \epsilon, 1 - \delta$

$$\text{MAX-E3LIN}_{\frac{1}{2} + \epsilon, 1 - \delta} \geq_p \text{LABEL-COVER}_{\eta, \delta}$$

goal of today show

$$\text{MAX-CUT}_{\arccos \frac{p}{\pi} + \epsilon, \frac{1-p}{2} - \epsilon} \geq_p \text{ULC}(m)_{\delta, 1 - \delta}$$

↑
unique label
cover

⇒ Goemans-Williamson algorithm is optimal for
MAX-CUT

① Unique Games Conjecture

def Unique Label Cover $ULC(m)$

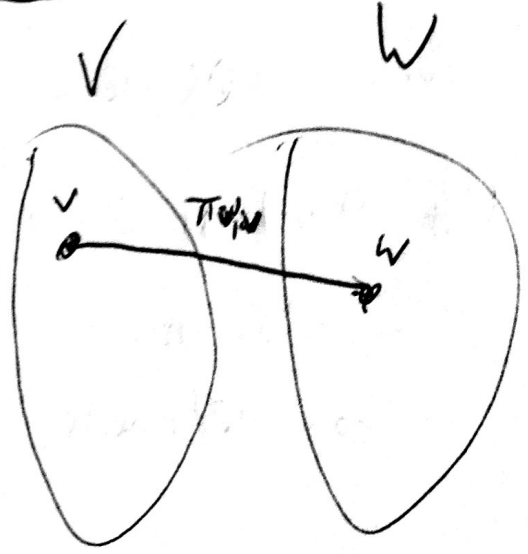
input - bipartite graph $(V \cup W, E)$

- set of labels Σ , where $|\Sigma| = m$

- edge functions: for all $(v, w) \in E$, there exists bijection

$$\pi_{v,w}: \Sigma \rightarrow \Sigma$$

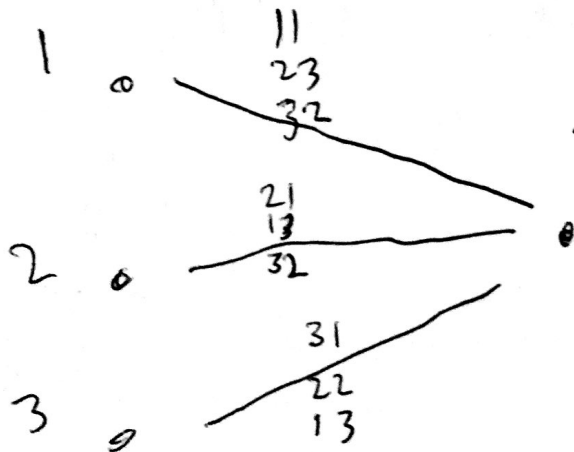
↑
makes this problem the unique label cover as opposed to label cover, in which $\pi_{v,w}$ not necessarily bijection



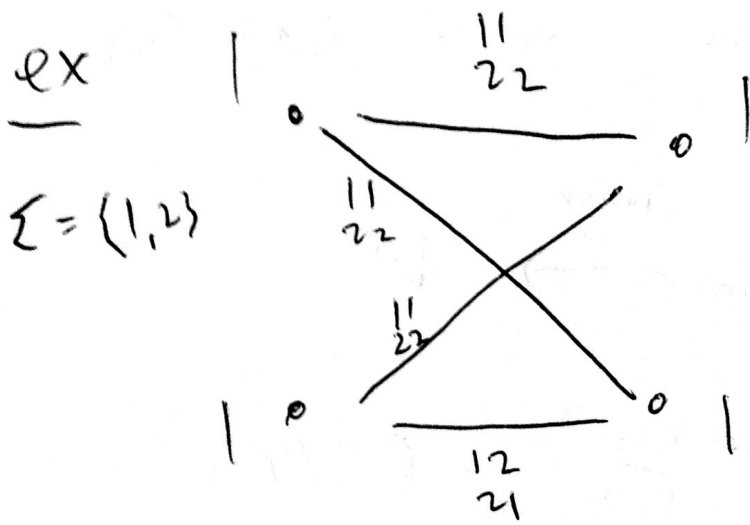
output label all vertices $\sigma: V \cup W \rightarrow \Sigma$ such that the fraction of satisfied edges is maximized

$$\text{satisfy edge } (v, w) \iff \pi_{v,w}(\sigma(v)) = \sigma(w)$$

ex $\Sigma = \{1, 2, 3\}$



all edges satisfied



Can satisfy at
most $\frac{3}{4}$ edges

Remark $ULC_{\Sigma, 1}$ is in P.

insight: since $\pi_{v,w}$ are bijections, given the label of a vertex, the labels of its neighbors are fixed. For each connected component of the bipartite graph, we can try all possible labels for a starting vertex and then search the rest of the component. This search is poly($m, |V| |U|$).

Unique games conjecture (Khot 2002) (UGC)

For all $\delta > 0$, there exists m such that $ULC(m)_{\Sigma, 1-\delta}$ is NP-hard.

Note all we did is change 1 to $1-\delta$ from the remark.

if conjecture is true, then a wide range of known approximations for optimization problems such as MAX-CUT, MAX-2SAT, ~~the~~ VERTEX-COVER are all optimal!

we will show that Goemans-Williamson is optimal for MAX-CUT, assuming UGC.

② Review: Goemans-Williamson for MAX-CUT

MAX-CUT ~~is~~ quadratic linear program $\xrightarrow{\text{relax}}$ SDP

$$\text{let } \alpha_{GW} = \frac{2}{\pi} \min_{-1 < p < 1} \frac{\arccos p}{1-p} \approx 0.879$$

then

occurs at
 $p \approx -0.689$

Goemans-Williamson is α_{GW} -approx. for MAX-CUT.

③ UG Hardness of Max-Cut

Theorem let $\epsilon > 0$, $-1 < p < 0$. ~~There exist~~ There exist δ and m such that

$$\text{MAX-CUT}_{\frac{\arccos p}{\pi} + \epsilon, \frac{1-p}{2} - \epsilon} \geq_p \text{ULC}(m)_{\delta, 1-\delta}$$

Corollary Goemans-Williamson is optimal, assuming UGC.

Proof NP Hard to approximate MAX-CUT factor

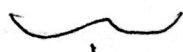
$$\geq \frac{\frac{\arccos p}{\pi} + \epsilon}{\frac{1-p}{2} - \epsilon} > \alpha_{GW}$$

Proof of thm 3 parts: reduction, completeness.

soundness



next lecture



this lecture

pick δ sufficiently small (will specify how small later) and then m such that $ULC(m)_{\delta, 1-\delta}$ is NP-Hard (assuming UGC).

We have black box that solves $MAX-CUT_{\frac{1-\delta}{2} \pm \epsilon, \frac{1+\delta}{2} - \epsilon}$ and we have instance of $ULC(m)_{\delta, 1-\delta}$.

Let $G = (V \cup W, E)$ be bipartite graph in $ULC(m)$.

~~Next step:~~

create new graph H with vertex set $(V \cup W) \times \{-1, 1\}^m$.

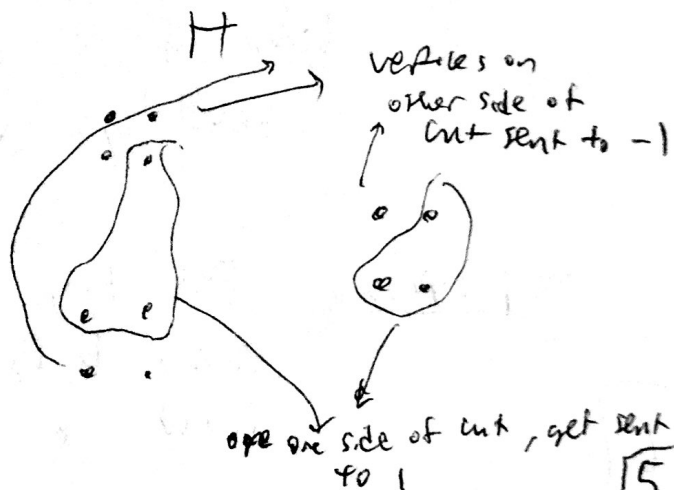
Associate to each $u \in V \cup W$ a long code encoding

$f_u: \{-1, 1\}^m \rightarrow \{-1, 1\}$ given a cut of H (vertices in

one subset go to -1 , and vertices in the other

subset go to 1).

ex



~~Factor of~~
~~Note with cut on graph where each vertex~~
~~is sent to + or - (representing cut) domain~~
 ~~$f(x)$ or $f(x) = -1$ for $x \in V$ is equal to~~

First try at reduction

notation:

$x, y \in \{-1, 1\}^m$, $\pi: [m] \rightarrow [m]$ bijection

- xy coordinate-wise multiplication: $(xy)_i = x_i y_i$

- $x \circ \pi = (x_{\pi(1)}, \dots, x_{\pi(m)})$

① Randomly pick $(v, w) \in E$ with permutation π

② pick $x \in \{-1, 1\}^m$ uniformly

③ pick $\mu \in \{-1, 1\}^m$ ~~each coordinate~~ independently pick ea. coord.

$$\mu_i = \begin{cases} -1 & \text{w.p. } \frac{1-p}{2} \\ 1 & \text{w.p. } \frac{1+p}{2} \end{cases}$$

④ test $f_v(x) \neq f_w((x\mu) \circ \pi)$

if true, put edge between vertex in v 's hypercube labeled by x and vertex in w 's hypercube labeled by $(x\mu) \circ \pi$.

Problem Resulting graph bipartite: could make all $f_v \equiv 1$ for $v \in V$ and all $f_w \equiv -1$ for $w \in W$ and test always passes!

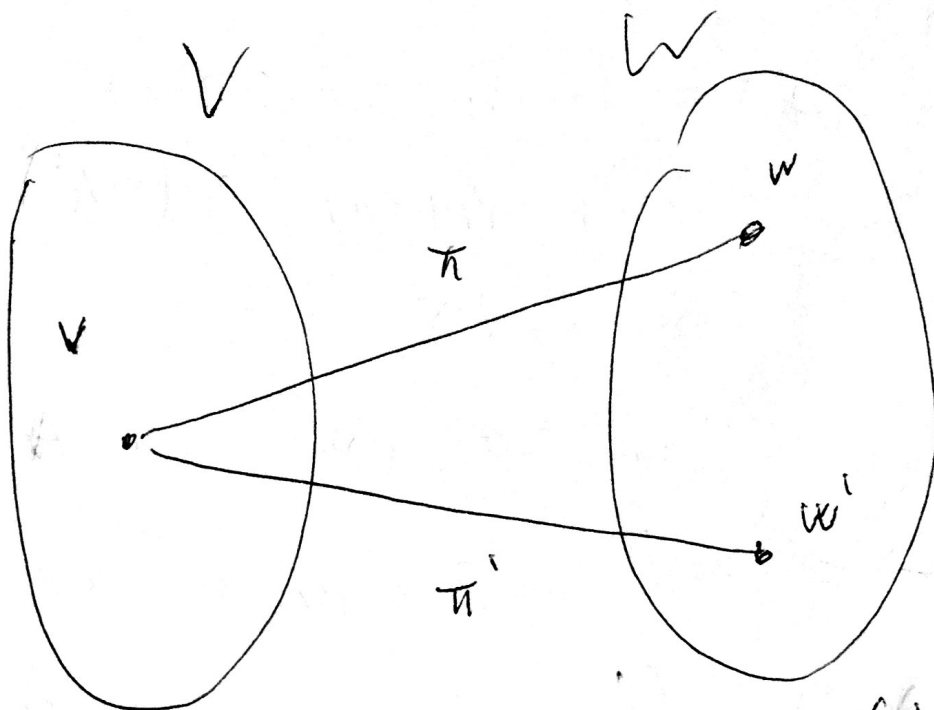


actual reduction only look at ~~one set of~~
 long codes of ~~the~~ vertices from one of V, W

- ① pick $v \in V$ uniformly, and two edges $(v, w), (v, w')$ uniformly at random with permutations π, π' respectively
- ② pick $x \in \{-1, 1\}^m$ uniformly
- ③ pick $\mu \in \{-1, 1\}^m$ where μ coordinates μ_i independent, chosen as

$$\mu_i = \begin{cases} -1 & \text{w.p. } \frac{1-p}{2} \\ 1 & \text{w.p. } \frac{1+p}{2} \end{cases}$$

- ④ test $f_v(x \circ \pi) \neq f_{w'}(x \mu \circ \pi')$



$(v, w), (v, w')$ satisfied $\Leftrightarrow \pi^{-1}(\sigma(w')) = \sigma(v), \pi(\sigma(w)) = \sigma(v)$.



Completeness

Suppose $ULC(m)$ has assignment $\sigma: VUV \rightarrow \Sigma$
satisfying $\geq 1 - \delta$ fraction of edges. Let
each f_u be ~~proper~~ long-encoding of $\sigma(u)$.
the detector function. $f_u(x) = x \circ \sigma_u$ for all $u \in VUV$,
 $x \in \{-1, 1\}^m$.

~~Pr~~

Edges $(v, w), (v, w')$ from test

~~Pr (both edges satisfied)~~

$A = \neg(v, w)$ satisfied

$A' = (v, w')$ satisfied

By union bound,

$$\begin{aligned} \Pr(A \cap A') &= 1 - \Pr(\neg A \cup \neg A') \\ &\geq 1 - \Pr(\neg A) - \Pr(\neg A') \\ &\geq 1 - 2\delta \end{aligned}$$

Now look at prob. test passes given $A \cap A'$.

$$f_w(x \circ \pi) = (x \circ \pi) \circ \sigma_w = x_{\pi(\sigma_w)} = x_{\sigma(v)}$$

$$\begin{aligned} f_{w'}((x, \mu) \circ \pi') &= ((x, \mu) \circ \pi') \circ \sigma_{w'} = (x, \mu)_{\pi'(\sigma_{w'})} \\ &= (x, \mu)_{\sigma(v)} = x_{\sigma(v)} \mu_{\sigma(v)} \end{aligned}$$

$$\Pr [f_w(x_0, \pi) \neq f_{w'}((x_M)_0, \pi')]]$$

$$= \Pr [\cancel{x_0(v)} \neq x_{\sigma(v)} M_{\sigma(v)}]$$

$$= \Pr [M_{\sigma(v)} = -1]$$

$$= \frac{1-p}{2}$$

Thus

$$\Pr (\text{test passes}) \geq \left(\frac{1-p}{2}\right) (1-2\delta)$$

$$\geq \left(\frac{1-p}{2}\right) - \epsilon$$

$$\text{if } \delta \leq \frac{\epsilon}{2}.$$



Shows completeness,
next lecture will
show soundness