

Announcement: Homework 10 will be released Sunday, deadline the following Sunday.

Theme: What do you do if you have to solve an NP-hard problem?

Approx alg: always run in poly time, and their answer, while not always optimal, is guaranteed to be within some distance of optimal.

This definition makes sense for optimization problems: those that require maximizing or minimizing some quantity.  
(Aside: also makes sense for counting problems.)

Def: Algorithm  $\text{ALG}$  is an  $\alpha$ -approximation for problem  $\Pi$  if it is the case that if input instance  $x$  of  $\Pi$  with optimal solution  $\text{OPT}(x)$ ,

$$\frac{1}{\alpha} \text{val}(\text{OPT}(x)) \leq \text{val}(\text{ALG}(x)) \leq \alpha \cdot \text{val}(\text{OPT}(x))$$

automatic by definition of  $\text{OPT}(x)$

This inequality is the right-hand inequality, rescaled.

"approximation guarantee"  $\alpha \geq 1$ .

Closer to 1  $\Rightarrow$  closer to optimal.

[minimization problem] [maximization problem]

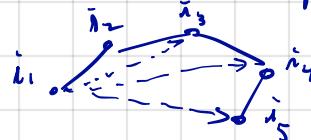
EXAMPLE: Metric Traveling Salesman Problem.

Recall, in this problem we are given a table of distances  $d(i,j)$  between cities  $i, j$  for  $1 \leq i, j \leq n$ .

Assume  $d$  is

- symmetric  $d(i,j) = d(j,i)$
- metric ( $\Delta$  inequality)  $d(i,j) + d(j,k) \geq d(i,k) \quad \forall i,j,k$   
 $\Rightarrow$  any path  $i_1, i_2, \dots, i_p$

$$d(i_1, i_2) + d(i_2, i_3) + \dots + d(i_{p-1}, i_p) \geq d(i_1, i_p)$$



Objective: visit each of cities  $1, \dots, n$  and return to starting point, minimizing total distance traveled.

Recall: NP-hard because UNDIR HAM CYCLE  $\leq_p$  METRIC TSP  
 If  $G$  is an instance of undir Ham cycle with vertex set  $\{v_1, \dots, v_n\}$  then create metric TSP with

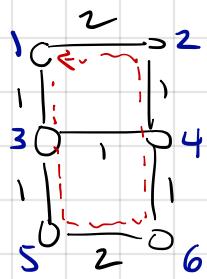
$$d(i, j) = \begin{cases} 1 & \text{if } (v_i, v_j) \in E \\ 2 & \text{if not} \end{cases}$$

A traveling salesman tour of total length  $n$  exists if and only if  $G$  has a ham. cycle.

How to approximate the optimum?

Beautiful idea:

- [1] if we take any  $n$ -cycle through the cities and remove one of its edges, we get a spanning tree. (which happens to be a path.)
- [2] we know how to compute the min spanning tree efficiently.
- [3] maybe the min spanning tree is close to the minimum traveling salesman tour?



(All other distances are shortest path distances.)

Cost of cheapest traveling salesman tour?

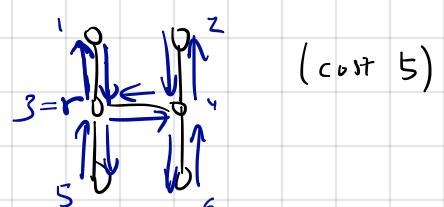
- (A) 6  
 (B) 8  
 (C) 10

If you solve MST on this graph:

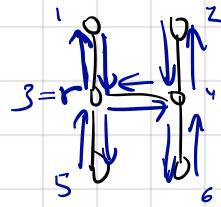
What order to visit the cities, using this tree as a hint?

Answer: DFS!

DFS order starting from root node 3 is 3, 1, 3, 5, 3, 4, 6, 4, 2, 4, 3



If you solve MST on this graph:



(cost 5)

What order to visit the cities, using this tree as a hint?

Answer: DFS!

DFS order starting from root node 3 is 3, 1, 3, 5, 3, 4, 6, 4, 2, 4, 3

DFS order of tree  $T$ : if  $r = \text{root of } T$ , and

$r_1, r_2, \dots, r_k$  are children of  $r$ , and  $T_1, T_2, \dots, T_k$  are the subtrees rooted at these children



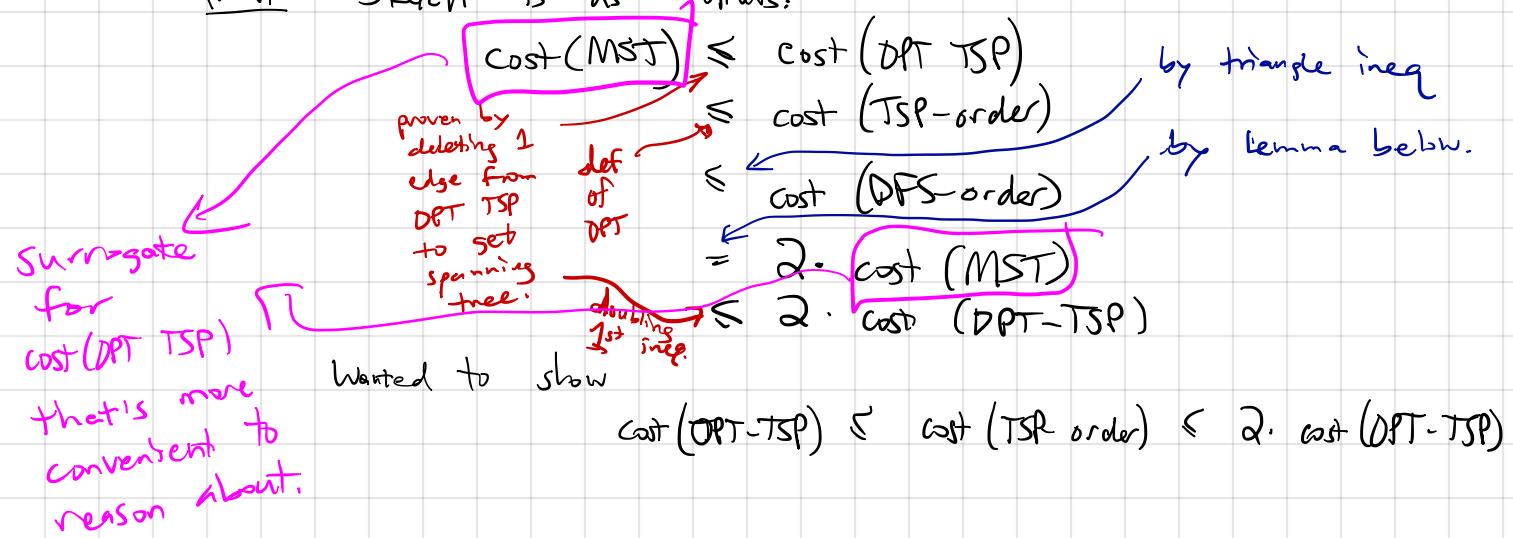
DFS-order( $T$ ) is defined recursively by

- $[r]$  if  $k=0$  ( $T$  has one node)
- $[r, \text{DFS-order}(T_1), r, \text{DFS-order}(T_2), r, \dots, \text{DFS-order}(T_k), r]$

TSP-order( $T$ ) is defined by computing DFS-order( $T$ ) and removing all copies of each node except the first one in the sequence. Finally, repeat starting pt.  
E.g. 3, 1, 3, 5, 3, 4, 6, 4, 2, 4, 3 becomes 3, 1, 5, 4, 6, 2, 3

Claim: If you solve any Metric TSP problem by computing min spanning tree,  $T$ , and returning TSP-order( $T$ ), this is a 2-approximation.

Prof. Sketch is as follows:

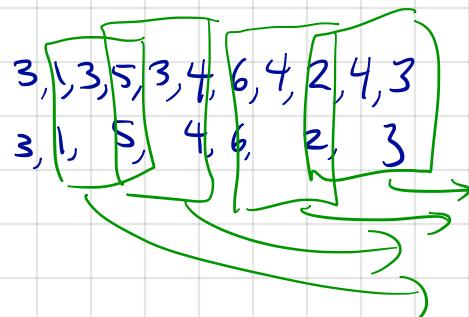


$$\begin{aligned}
 & \text{cost (TSP-order)} \\
 & \leq \text{cost (DFS-order)} \quad \text{by triangle ineq} \\
 & = 2 \cdot \text{cost (MST)} \quad \text{by lemma below.}
 \end{aligned}$$

For any sequence  $i_1, i_2, \dots, i_p$  define

$$\text{cost}(i_1, i_2, \dots, i_p) = \sum_{s=1}^{p-1} d(i_s, i_{s+1}).$$

DFS-order:



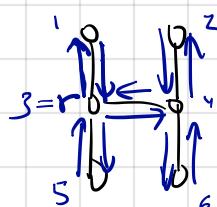
TSP-order:

$$\begin{aligned}
 \text{cost (top seq)} &\geq \\
 \text{cost (bottom seq)} & \\
 \text{by } \Delta \text{ ineq.} &
 \end{aligned}$$

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Lemma. Each edge of the MST  $\Gamma$  appears exactly twice when we look at the list of pairs of nodes that occur consecutively in DFS-order ( $\Gamma$ ).

Proof. (By picture)



(by induction) True when  $\Gamma$  has one node

and no edges,

$$\text{DFS-order}(\Gamma) = [r]$$

$(r, r_2)$  occurs twice

$$\begin{aligned}
 \text{Else } \text{DFS-order}(\Gamma) = [r, & \text{DFS-order}(\Gamma_1), r, \text{DFS-order}(\Gamma_2), \\
 & \dots, \text{DFS-order}(\Gamma_k), r]
 \end{aligned}$$

Every edge of  $r$  occurs exactly twice.

Ind hyp: every edge of  $\Gamma_1 \cup \Gamma_2 \cup \dots \cup \Gamma_k$  occurs exactly twice.