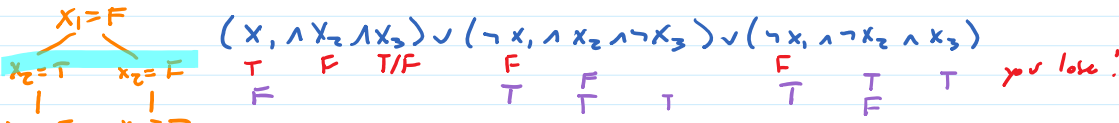


PSPACE

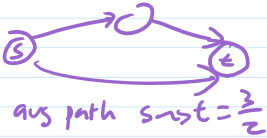
QSAT: Given  $\varphi$ , determine whether  $\exists x_1 \forall x_2 \exists x_3 \dots \varphi(x_1, \dots, x_n)$  is true.



# leaves  $\approx 2^{\frac{n}{2}}$  (2 branches every other level)

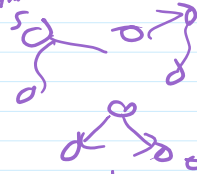
QSAT  $\in$  NP?? not by this verification alg

AVG-PATH-LEN: Given directed  $G$ , vertices  $s, t$ , integer  $k$ , determine if avg path length  $s \rightarrow t \leq k$



AVG-PATH-LEN  $\in$  NP??  
not by simple verification alg

evidence = list of paths and their lengths  
not polynomial!

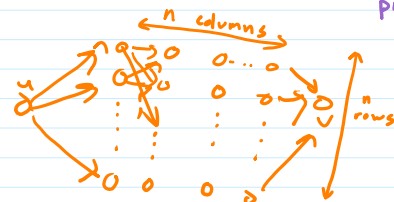


how to verify claim that avg  $s \rightarrow t$  path length = 10?

AVG-PATH-LEN is NP-hard (for all  $x \in \text{NP}$ ,  $x \in \text{A-P-L}$ )

ST-DIR-HAM-PATH  $\leq_p$  AVG-PATH-LEN

given  $G$ , replace every  $u \rightarrow v$  with



one  $s \rightarrow t$  HP in  $G$  becomes  $(n)^{n-1}$  paths of length  $(n-1)(n+1)$

$n = 10^{10}$  one HP  $\rightarrow (10^{10})^9$  paths of len 99  
 $\leq 10 \cdot 10! (10^{10})^9$  of len  $\leq 88, \geq 11$   
 $10^{10} \gg 10 \cdot 10!$ , so avg very close to 99

all other paths in  $G$  become  $\leq (n)^{n-2}$  paths of length  $\leq (n-2)(n+1)$

new graph has avg. path len.  $> (n-2)(n+1) \iff G$  has a HP (bc so many long paths from a single HP in  $G$ )

PSPACE: set of problems that can be solved in poly space

QSAT  $\in$  PSPACE

eval( $\varphi, Q, i$ )

linear storage per level  
linear # levels  
total space quadratic  $\delta$  (polynomial)

```

Q' ← other quantifier
 $\varphi_T$  ←  $\varphi$  with  $x_i$  set to T
 $\varphi_F$  ←  $\varphi$  " " F
 $r_T$  ← eval( $\varphi_T, Q', i+1$ )
 $r_F$  ← eval( $\varphi_F, Q', i+1$ )
if  $Q = \forall$  and  $r_T$  and  $r_F$  both T
    return T
else if  $Q = \exists$  and  $r_T$  or  $r_F = T$ 
    return T
else
    return F
    
```

AVG-PATH-LEN  $\in$  PSPACE

go through all paths  
add len of each to running total, incr count  
return  $\frac{\text{tot}}{\text{count}} \leq k$

P  $\in$  PSPACE

bound on time = bound on space b/c  $O(1)$  storage added per step

$NP \subseteq PSPACE$   
 $co-NP \subseteq PSPACE$

Let  $X \in NP$  [want:  $X \in PSPACE$ ]  
Then  $\exists$  poly-time verifier  $X\text{-VERIFY}$

$O(1)$   $X(n)$  verified = F  
poly for each  $y$   
verified  $\leftarrow$  verified ( $X\text{-VERIFY}(x,y)$ ) poly-time,  
return verified so poly-space

$P \stackrel{?}{=} PSPACE$   
 $NP = PSPACE$

open questions

QSAT is PSPACE-complete (for all  $X \in PSPACE$ ,  $X \leq_p QSAT$ )

## Approximation Algorithms

FIND-VERTEX-COVER: given undirected  $G$ , output smallest vertex cover

a 2-approximation algorithm always outputs a VC of size  $\leq 2 \cdot |C^*|$   
↑  
smallest vertex cover

APPROX-FIND-VERTEX-COVER( $G$ )

```
C ← ∅           the cover
A ← ∅
E' ← E         uncovered edges
while E' ≠ ∅
  pick (u,v) from E'
  C ← C ∪ {u,v} ] preserves a)
  A ← A ∪ {(u,v)} ] preserves b)
  remove from E' all edges w/ u as endpoint
  and all w/ v as endpoint
return C
```

INVARIANT: a)  $|C| = 2 \cdot |A|$

b) edges in  $A$  have no endpoints in common w/ each other or edges in  $E'$

c)  $C$  covers edges not in  $E'$

$$\begin{aligned} & \text{optimal cover} \\ & |C^*| \geq |A| \quad C^* \text{ contains } \geq 1 \text{ endpoint of each } (u,v) \in A \\ & \quad \text{since endpoints in } A \text{ are unique} \\ & |C| = 2|A| \leq 2 \cdot |C^*| \\ & \quad \uparrow \quad \quad \uparrow \\ & \text{INV} \quad \quad \text{prev. line} \end{aligned}$$

# Approximate TSP

$$l(u,v) \leq l(u,x) + l(x,v)$$

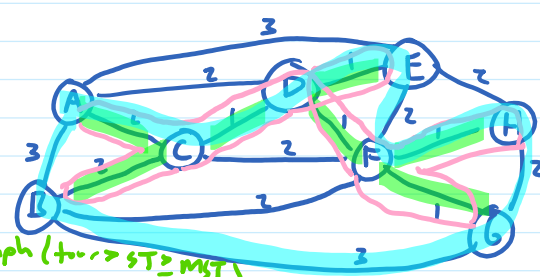
## (FIND-TSP-METRIC)

FIND-TSP- $\Delta$ : Given weighted undirected  $G$  that satisfies triangle inequality, find lowest weight tour.

APPROX-FIND-TSP- $\Delta(G)$   
 $T \leftarrow \text{MST}(G)$   
 $S \leftarrow \text{preorder}(T)$

$S = A C B D E F G H A$   
 $S' = A C B \cancel{D} E F G \cancel{H} \cancel{F} \cancel{D} \cancel{C} A$

shortest tour  $l(S') = 2l(T)$   $S'$  goes over each edge twice  
 $l(H^*) \geq l(T)$   $H^*$  - one edge spans the graph ( $H^* \rightarrow T = \text{MST}$ )  
 $l(S) \leq l(S')$   $\Delta$  inequality



$$l(S) \leq l(S') = 2 \cdot l(T) \leq 2 \cdot l(H^*)$$

so this is a 2-approximation of FIND-TSP- $\Delta$

General TSP is not  $k$ -approximable for  $k \geq 1$  (unless  $P = NP$ )

## HC(G)

1) Build complete  $G'$  with same vertices as  $G$

$$\text{Set } w(u,v) = \begin{cases} 1 & \text{if } (u,v) \text{ in } G \\ \infty & \text{otherwise} \end{cases}$$

$\infty = 2 + n$   
 $\infty = (k-1)n$

2) find a tour in  $G'$  with cost  $\leq k \cdot \text{optimal}$

3) if cost of that tour is  $\leq 2n$ , output YES  
 else output NO

if  $G$  has HC then  $G'$  has tour of cost  $n$   
 so step 2 returns tour of cost  $\leq 2n$   
 alg outputs YES

if  $G$  has HC then  $G'$  has tour of cost  $\leq Z_n$   $k_n$   
so step 2 returns tour of cost  $\leq Z_n$   
alg outputs YES

if  $G$  has no HC then optimal tour in  $G'$  has cost  $\geq Z_n + (n-1)$   
 $\geq Z_n + 1$   
 $Z_n + 1$

so step 2 returns tour of cost  $\geq Z_n + 1$   
so outputs NO

## Randomized Algorithms

### 3-SAT-RANDOM

- 1) pick random assignment
- 2) while # clauses satisfied  $\leq \frac{7}{8}k$
- 3) pick a new random assignment

$Z$  := # clauses satisfied by random assignment

$$= Z_1 + Z_2 + \dots + Z_k \quad \text{where } Z_i = \begin{cases} 1 & \text{if clause } i \\ 0 & \text{otherwise} \end{cases}$$

$$E[Z] = E[Z_1] + \dots + E[Z_k]$$

$$= \frac{7}{8} + \dots + \frac{7}{8} = \frac{7}{8}k$$

$$P(\text{random assignment satisfies } \geq \frac{7}{8}k \text{ clauses}) \geq \frac{1}{8k}$$

$$E[\text{iterations of loop}] \leq 8k$$

3-SAT-RANDOM is expected poly-time alg to find assignment that satisfies  $\geq \frac{7}{8}k$  clauses