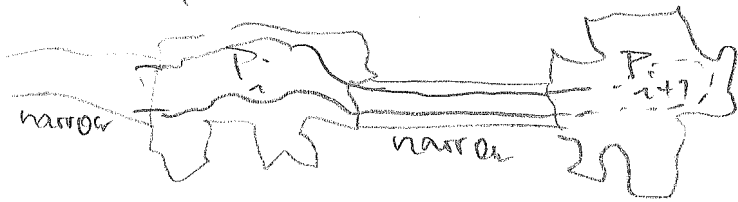


Theorem Shortest DFS is  $\frac{4}{3}$ -Competitive.

Proof Remove from  $P$  all narrow passages  $\leadsto$  polygons  $P_1, \dots$

OPT must proceed this way:



$\Rightarrow$  Can consider each  $P_i$  separately.

Claim  $\forall i: S(P_i) \leq \frac{4}{3} C(P_i) - 2$  (THEN DONE)

Proof By induction on # split cells in Layer 1 of  $P_i$ .

$$\# = 0: S(P_i) \stackrel{\text{Lemma 5}}{\leq} C(P_i) + \frac{1}{2} E(P_i) - 5 \stackrel{\text{Lemma 4}}{\leq} C(P_i) + \frac{1}{2} \left( \frac{2}{3} C(P_i) + 6 \right)$$

$$\leq \frac{4}{3} C(P_i) - 2 \quad \checkmark$$

$\# \geq 1$ : Consider 1st split cell  $c$  in Layer 1

4 cases  $\rightarrow$  (18)

$P_i$  liegt. oder in Fall (iv) bei einfacher Adjazenz das Rechteck  $Q$  von  $c$  und  $c'$  mit  $|Q| = 2$ .

Analog zum Beweis von Theorem 1.15 teilen wir das Polygon  $P_i$  in zwei Teile  $P'$  und  $P''$ , ein, die beide  $Q$  enthalten. Dabei sei  $P''$  das Polygon der Komponenten vom Typ (I) oder (II) und  $P'$  das andere.

Für  $|Q| = 1$ , siehe Abbildung 1.22(i) gilt offensichtlich  $S(P_i) = S(P') + S(P'')$  aber auch  $C(P_i) = C(P') + C(P'') - 1$ . Wenden wir die Induktionsvoraussetzung auf  $P'$  und  $P''$  an, dann erhalten wir

$$\begin{aligned}
S(P_i) &= S(P') + S(P'') \\
&\leq \frac{4}{3}C(P') - 2 + \frac{4}{3}C(P'') - 2 \\
&\leq \frac{4}{3}C(P_i) + \frac{4}{3} - 4 < \frac{4}{3}C(P_i) - 2.
\end{aligned}$$

Falls  $|Q| = 4$  gilt sparen wir durch das Vereinigen der Polygone wieder ein paar Schritte ein. Zunächst betrachten wir  $P'$  und  $P''$  getrennt und zählen die Schritte von  $c'$  nach  $c$  (oder umgekehrt) in beiden Polygonen. Im gesamten  $P_i$  jedoch wird der Pfad von  $c'$  nach  $c$  in  $P'$  bereits in  $P''$  übernommen und umgekehrt. Also sparen wir hier insgesamt mindestens vier ( $=|Q|$ ) Schritte. Dann haben wir also  $S(P_i) = S(P') + S(P'') - 4$  und  $C(P_i) = C(P') + C(P'') - 4$ . Das ergibt mit Induktionsannahme für  $P'$  und  $P''$

$$\begin{aligned}
S(P_i) &= S(P') + S(P'') - 4 \\
&\leq \frac{4}{3}C(P') + \frac{4}{3}C(P'') - 8 \\
&= \frac{4}{3}(C(P') + C(P'') - 4) - \frac{8}{3} \\
&< \frac{4}{3}C(P_i) - 2.
\end{aligned}$$

Der Fall  $|Q| = 2$  ist eine leichte Übungsaufgabe, das Ergebnis gilt auch hier! Eine optimale Strategie benötigt  $\geq C(P_i)$  oder insgesamt  $\geq C(P)$  Schritte, insgesamt gilt ein kompetitiver Faktor von  $\frac{4}{3}$ .  $\square$

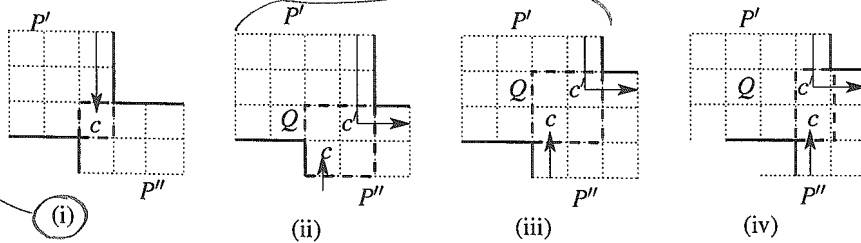


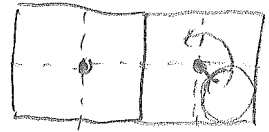
Abbildung 1.22: Ein Polygon  $P_i$  zerfällt an einer Spitzelle und wir haben Komponenten von Typ (I) oder (II). Das Quadrat/Rechteck  $Q$  liegt hier stets innerhalb von  $P_i$ .



# Cleaning a cellular environment (with holes)

(Gabriely, Rimon 2001-2003)

each cell has 4 subcells



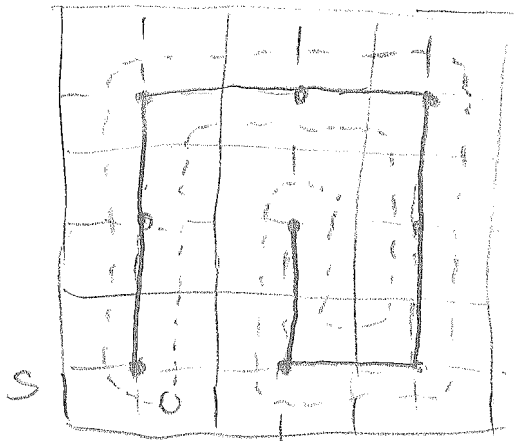
robot moves between cell centers

must clean all subcells using rotating cleaning tool that cannot be lifted off the ground

easy case: all subcells free

- perform DFS on the cells
- keep cleaning tool to the right of resulting tree

P



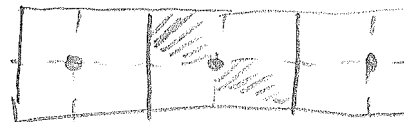
→ each subcell visited exactly once

each cell twice  
→ optimal

more complicated some subcells may be blocked.



multiple subcell visits



no connection needs visits from both sides

→ strategy Spiral STC (Spanning Tree Covering)

By clever counting arguments:

Let  $P$  be grid polygon with  $C$  reachable subcells

$K = \#$  free subcells diagonally adjacent to blocked subcells

Theorem Spiral STC explores in time  $O(C)$  all reachable subcells. The cleaning tool moves  $\leq C + K$  steps.

all edges of unit length

Graph exploration ... visit all vertices and edges

We already know: competitive ratio = 2

(DFS + lower bound for grid polygons with holes)

reach + topology

... with additional constraints:

- (i) tethered robot (connected by <sup>(= vacuum cleaner)</sup> power cable, to  $s$ )
- (ii) piecemeal exploration (robot must regularly return to  $s$  for recharging)

Which task is more difficult?

Surprisingly, there is no big difference.

Let  $r :=$  radius of graph  $G = (V, E)$

$=$  max shortest path length from  $s$  to any  $p \in V$   
(path length = # edges; unit weight model)

Clear: tethered robot needs cable of length  $\geq r$   
we assume  $(1 + \alpha)r$ ,  $\alpha > 0$ .

battery powered robot needs power pack capacity  $\geq (1 + \beta)r$

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(path length = # edges; unit weight model)

Clear: tethered robot needs cable of length  $\geq r$   
we assume  $(1 + \alpha)r$ ,  $\alpha > 0$ .

battery powered robot needs power pack capacity  $\geq 2(1 + \beta)r$

Lemma Let  $\alpha < \beta$ . Then, any  $(1+\alpha)r$  strategy for tethered robots can be converted into a  $2(1+\beta)r$  piecemeal explorative strategy, at  $\frac{1+\beta}{\beta-\alpha}$  extra cost.

Proof Let  $A$  be a  $(1+\alpha)r$  strategy for tethered robots.

Every  $2(\beta-\alpha)r$  steps,  $A$  stops, goes to  $s$  (to recharge), comes back to  $p$ , and resumes.

Distance from  $p$  to  $s$ :  $\leq (1+\alpha)r$

$\Rightarrow$  power consumption between visits to  $s$ :

$$\leq 2(\beta-\alpha)r + 2(1+\alpha)r = 2(1+\beta)r$$

$\Rightarrow$  have obtained  $2(1+\beta)r$  piecemeal strategy.

$$\text{Cost} = \underbrace{T}_{\text{cost of } A} + \underbrace{\frac{T}{2(\beta-\alpha)r}}_{\# \text{ recharge ops}} \underbrace{2(1+\alpha)r}_{\text{max cost of recharge op}} = \frac{1+\beta}{\beta-\alpha} T \quad \square$$

Conversely,

Lemma Each  $(1+\beta)r$  piecemeal strategy can be converted into a  $2(1+\beta)r$  tethered strategy, at  $\leq$  twice the cost.

The complexities of the optimum offline solutions are unknown.

We are interested in on-line. Will consider tethered robot model,  $(1+\alpha)r$  cable length,  $\alpha > 0$ .

Clearly, plain DFS does not work (what happens if robot runs out of cable?)

Therefore, vertex remaining cable length

Bounded DFS ( $v, l$ )

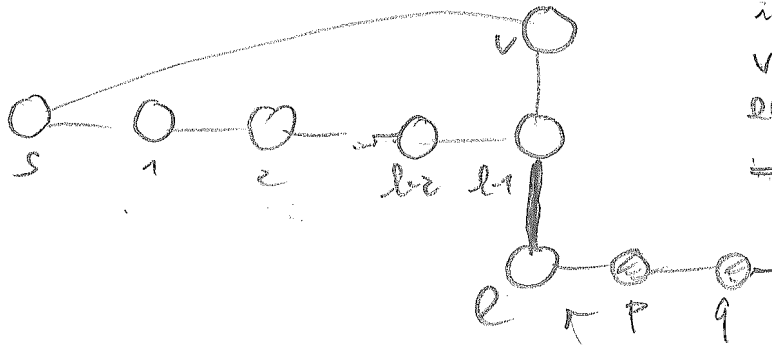
if  $v$  is tagged then return;  
 if  $l = 0$  then (no more cable; must backtrack)  
 if  $v$  has unexplored edge left then mark  $v$  as "incomplete"  
 else mark  $v$  as explored  
 return;

mark  $v$  as tagged;  
 for each unexplored edge  $(v, w) \in E$   
 move robot along  $(v, w)$  to  $w$ ;  
 mark  $(v, w)$  as explored;  
 Bounded DFS ( $w, l-1$ )  
 move robot back along  $(v, w)$  from  $w$  to  $v$ ;  
 mark  $v$  as explored

vertex  $v$  can be  
 unexplored  
 incomplete  
 explored  
 tagged (= on the stack)

Looks good, but doesn't solve exploration problem!

Example:



if robot first explores  
 vertices  $1, 2, \dots, l$   
 edge  $(l-1, l)$  is marked exp  
 $\Rightarrow$  will not be visited  
 again, because vertex  
 gets marked as explored  
 when robot comes fro

$\rightarrow$  need better approach!

(CFR moves robot by DFS to this vertex, and starts exploring it because it is unexplored)

Theorem (Duncan, Kobourov, Kumar 01/06)

On unknown graph of known radius  $r$  can be explored by a tethered robot with  $(1+\alpha)r$  cable within  $\mathcal{O}(|E| + |V|/\alpha)$  many steps.  
 This strategy is  $(4 + \frac{8}{\alpha})$ -competitive.

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CFX( $s, r, \alpha$ )

Initially the only tree is  $\{s\}$

Repeat

Let  $T_i$  be the closest subtree to  $s$  in  $G^*$

Let  $s_i$  be the closest vertex in  $T_i$  to  $s$

prune( $T_i, s_i, \alpha r/4, \alpha r/2$ )

producing  $\mathcal{T}_i = \{T_{i_0}, T_{i_1}, \dots, T_{i_k}\}$

// Here  $T_i = \cup_{T \in \mathcal{T}_i} T$

$\mathcal{T} \leftarrow \mathcal{T} \setminus \{T_i\} \cup \mathcal{T}_i$

Let  $T \in \mathcal{T}_i$  such that  $s_i \in T$

explore( $T, s_i, (1 + \alpha)r$ )

remove all explored trees from  $\mathcal{T}$

merge any trees in  $\mathcal{T}$  with common vertices

Until  $\mathcal{T} = \emptyset$

prune( $T, v, \text{minD}, \text{maxD}$ )

If  $T = \{s\}$ , return

Root  $T$  at  $v$

$\mathcal{T}_i \leftarrow \{T\}$

for each vertex  $w \in T$  such that  $d_T(v, w) = \text{minD}$

Let  $T_w \subseteq T$  be the subtree of  $T$  rooted at  $w$

if  $\Delta_T(v, T_w) > \text{maxD}$

// Separate subtree  $T_w$  from  $T$

$T \leftarrow T \setminus T_w$

$\mathcal{T}_i \leftarrow \mathcal{T}_i \cup \{T_w\}$

explore( $T, s_i, l$ )

MOVE ROBOT from  $s$  to  $s_i$  via shortest known path

MOVE ROBOT using depth first traversal on  $T$

for each incomplete vertex  $v$  visited

Let  $l'$  be the length of rope remaining

Call  $\text{bDFS}(v, l')$  *BoundedDFS*( $v, l'$ )

Let  $E'$  be the set of new explored edges

Let  $V'$  be the set of vertices in  $E'$

Let  $\mathcal{T}'$  be a spanning forest of  $G' = (V', E')$

$\mathcal{T} \leftarrow \mathcal{T} \cup \mathcal{T}'$

MOVE ROBOT BACK from  $s_i$  to  $s$  retracing old path

Figure 2: The CFX algorithm with start node  $s$  and rope length  $(1 + \alpha)r$



CFX runs in phases

$G^* \subseteq G$ : all edges and vertices explored or incomplete so  
 maintains set  $\mathcal{T} = \{T_{i-1}\}$  of vertex-disjoint subtrees of  $G^*$   
 containing all incomplete vertices

single phase

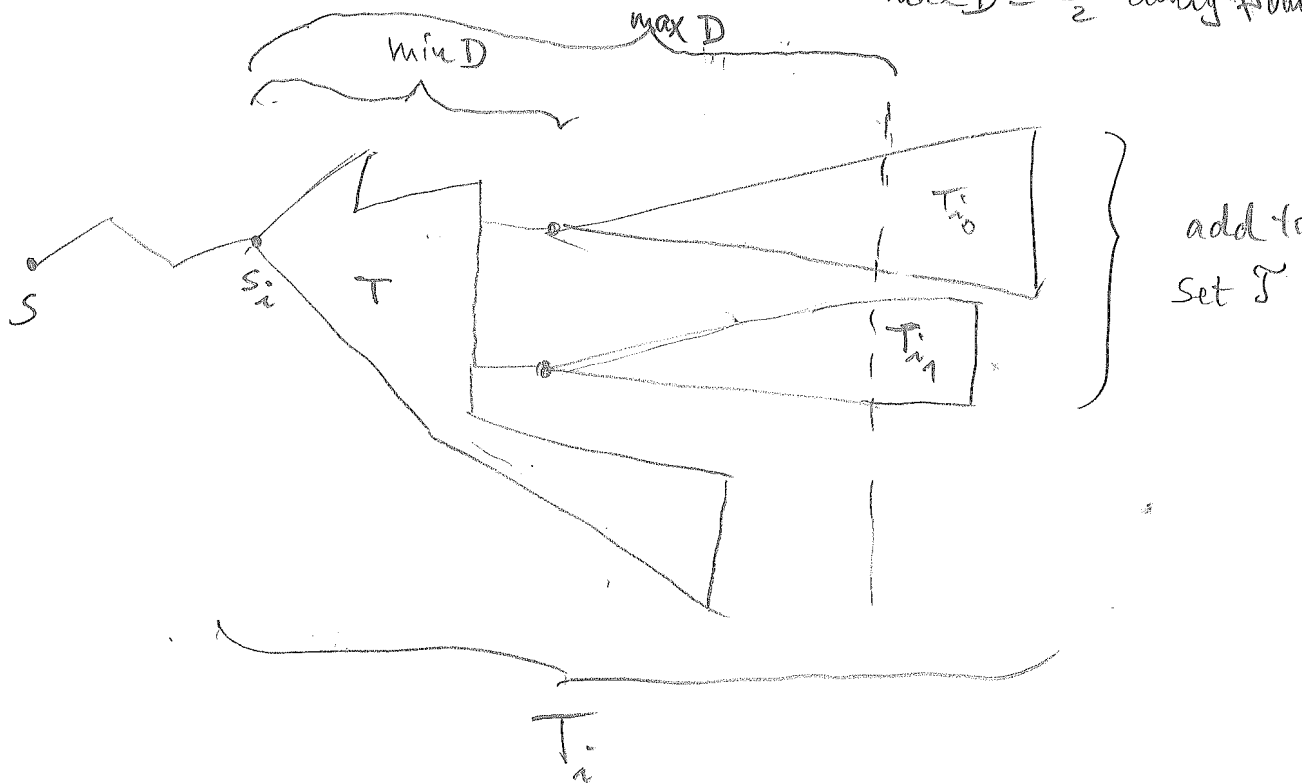
$T_i \in \mathcal{T} :=$  tree closest to  $s$

$s_i \in T_i :=$  vertex of  $T_i$  closest to  $s$

prune  $(T_i)$  : roots of subtrees  
 leaves of subtrees at least

$\min D = \frac{\alpha r}{4}$  away from

$\max D = \frac{\alpha r}{2}$  away from



- explore  $(T, s_i, \ell)$
- move robot from  $s$  to  $s_i$  on shortest path in  $G^*$
  - perform DFS traversal on  $T$
  - for each incomplete vertex in  $T$ 
    - call Bounded DFS with remaining cable length
    - $\rightarrow$  new explored edges form more trees  $T'$ : add to
  - move robot back from  $s_i$  to  $s$  on old path
  - clean up  $\mathcal{T}$ :
    - remove all trees explored
    - merge all trees sharing vertices

Initially,  $\mathcal{T} = \{s\}$  (the only incomplete vertex) (2)

robot starts with  $\text{BoundedDFS}(s, (1+\epsilon)r)$

Claim 1 Each incomplete vertex belongs to some  $T \in \mathcal{T}$

Proof True for  $\mathcal{T} = \{s\}$ . Afterwards, vertices newly marked unexplored in  $\text{BoundedDFS}$ .

They end up in trees  $T$  that are added to  $\mathcal{T}$  (and not removed since not explored)

Claim 2 If  $G^* \not\subseteq G$  then exists incomplete vertex  $v$  such that  $d_{G^*}(s, v) \leq r$ .

↳ shortest path length in  $G^*$

Proof Let  $v$  be the the incomplete vertex closest to  $s$  in  $G$

Assume  $d_{G^*}(s, v) > r$ .

Let  $\pi = \pi_G(s, v)$  be the true closest path, by radius assumption:  $|\pi| \leq$

$\pi = (s, p_1) (p_1, p_2) \dots (p_i, p_{i+1}) \dots (p_d, v)$

↳ first edge of  $G^*$

(must exist; otherwise

$d_{G^*}(s, v) = d_G(s, v)$ )

$\Rightarrow p_i$  incomplete and

$d_{G^*}(s, p_i) = d_G(s, p_i) < d_G(s, v) \leq r < d_{G^*}(s, v)$  ↳ minimum of  $v$

(25.1)

Claim 4 After 1st phase, each tree in  $\mathcal{T}$  is of size

$$|\mathcal{T}| \geq \frac{\alpha r}{4}$$

Proof After first call  $\text{BoundedDFS}(s, (1+\epsilon)r)$ , either  $G$  is fully explored (done!), or

(phase

Claim 3  $d_{G^*}(s, s_i) \leq r$

Proof  $\mathcal{T} \neq \emptyset \Rightarrow$  there are incomplete vertices

Let  $v$  be one closest to  $s \Rightarrow$  Claim 2  $d_{G^*}(s, v) \leq r$

Claim 1  $\Rightarrow v$  contained in some  $T' \in \mathcal{T}$

let  $s' \in T'$  be closest to  $s$  in  $G^*$

$$\Rightarrow d_{G^*}(s, s_i) \leq d_{G^*}(s, s') \leq d_{G^*}(s, v) \leq r.$$

Def  $s_i$  □ 3

single tree  $T'$  results. Then  $\mathcal{T} = \{T'\}$  and

$$|T'| \geq \underset{\text{Def Bounded DFS}}{\text{depth}(T')} = (1+\alpha)r > \frac{\alpha r}{4}$$

Later, two types of trees are added to  $\mathcal{T}$ :

(later ph)

① pruned parts of  $T_i$ :

bottom trees  $T_i$  have height  $\geq \max D - \min D = \frac{\alpha r}{4}$

top tree  $T$ : by induction,  $|T_i| \geq \frac{\alpha r}{4}$

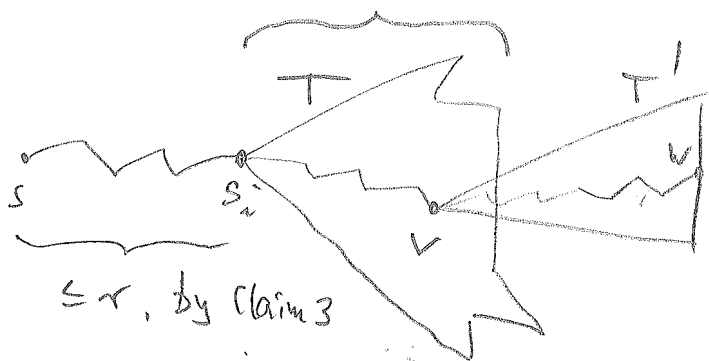
if no pruning occurs:  $|T| = |T_i| \geq \frac{\alpha r}{4}$

if pruning occurs:  $|T| > \text{height}(T) \geq \frac{\alpha r}{4}$

② trees  $T'$  visited in call  $\text{Bounded DFS}(v, l')$

containing incomplete vertex  $w$  (otherwise  $T'$  complete, would be removed from  $\mathcal{T}$ )

$$\leq \max D = \frac{\alpha r}{2}$$



$$\text{remaining cable at } v \geq (1+\alpha)r - r - \frac{\alpha r}{2} = \frac{\alpha r}{2} > 0$$

$$\Rightarrow |T'| \geq \underset{\text{Def. Bounded DFS}}{|\text{height}(T')|} \geq \frac{\alpha r}{2} > \frac{\alpha r}{4} \quad \boxed{4}$$

Claim 5 After  $\text{Explore}(T, s_i, l)$ , tree  $T$  is fully explored hence removed from  $\mathcal{T}$ .  $\boxed{5}$

robot's  
Step Cost

Phase 1,  $J = \{\{s\}\}$ .  $\leq 2|E|$

(later: only explore and Bounded DFS cause robot to move both run on pruned tree  $T$  (=top tree of  $T_i$ ))

$$S_1(T) : \text{path length } s \dots s_i \dots s : \leq 2r \leq \frac{8|T|}{\alpha}$$

$|T| \geq \frac{\alpha r}{4}$  by Claim

$$S_2(T) : \text{DFS on } T : 2|T|$$

$S_3(T) : \text{steps of Bounded DFS calls inside explore}(T)$

Let  $J_e$  denote the set of all trees explored

$$\Rightarrow \sum_{T \in J_e} S_3(T) = 2|E|, \quad \text{since Bounded DFS traverses only unexplored edges (but forward and back)}$$

$$\Rightarrow \# \text{ steps later} \leq \sum_{T \in J_e} (S_1(T) + S_2(T) + S_3(T))$$

$$\leq \sum_{T \in J_e} \left( \frac{8}{\alpha} + 2 \right) |T| + 2|E|$$

$$= \left( 2 + \frac{8}{\alpha} \right) \sum_{T \in J_e} |T| + 2|E|$$

$\leq 2|V|$ , since each vertex can be leaf and root of a tree

$$\Rightarrow \# \text{ steps total} \leq \left( 4 + \frac{16}{\alpha} \right) |V| + 2|E| + \underbrace{2|E|}_{\text{Phase 1}}$$

$\in O(|E| + \frac{|V|}{\alpha})$

$$\leq \left( 4 + \frac{16}{\alpha} \right) |V| + 4|E| \leq \left( 8 + \frac{16}{\alpha} \right) |E|$$

$\leq |E|$

OPT needs  $2|E|$ .  $\square$

Nice extensions:

edges of different weights

→ unknown radius  $r$

crude: guess radius  $r'$   
if too small to complete exploration:  
 $r' \leftarrow 2r'$

→ careful implementation  
 $O(|E| + |V| \log r)$

much better: prune  $(T_i, s_i, \frac{\alpha d_{G^*}(s_i, s_i)}{4}, \frac{9\alpha d_{G^*}(s_i, s_i)}{16})$   
instead of  $\min D = \frac{\alpha r}{4}, \max D = \frac{\alpha r}{2}$

explore  $(T_i, s_i, (1+\alpha) d_{G^*}(s_i, s_i))$   
instead of  $(1+\alpha)r$

Theorem Unknown Graph with unknown radius  $r$   
can be explored in  $O(|E| + \frac{|V|}{\alpha})$  steps by a  
tethered robot using cable of length  $\leq (1+\alpha)r$ .

(needs to re-prove most claims.)