

Motion Planning on a Graph

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1 Introduction

2 Preliminaries

In this paper, all graphs are simple, i.e., without self-loops or parallel edges, unless otherwise stated. A *weighted graph* G is a triple $(V(G), E(G), \text{cost}_G)$, where $V(G)$ is the vertex set of G , $E(G)$ is the edge set of G , and cost_G is a function from $E(G)$ to nonnegative reals, called the *cost function* of G . For each edge e of G , we call $\text{cost}_G(e)$ the *cost* of e . Let G be a (weighted) graph. For $U \subseteq V(G)$, $G \setminus U$ will denote the subgraph of G induced by $V(G) \setminus U$. When G is weighted, we assume that the subgraph inherits the cost function of G appropriately restricted. A *walk* in G is a sequence of vertices of G such that each pair of vertices consecutively appearing in the sequence are adjacent in G . If a walk starts from u and ends with v , we call u the *initial vertex* and v the *final vertex* of the walk. We say that a walk visits a vertex v if v appears in the sequence. A walk is a *path* if no vertex is repeated in the sequence. Although a walk is primarily a sequence of vertices, we can also view it as a sequence of (oriented versions of) edges. In particular, the *length* of walk W , denoted by $|W|$, is defined to be the number of edges in the walk. For each walk W of G , we extend the cost notation so that $\text{cost}_G(W)$ denotes the *cost* of W , i.e., the sum of the costs of all the edges in W .

We start by formalizing the rules of our game. Let G be a weighted graph. A *configuration* γ on G is a pair (O_γ, r_γ) , where O_γ is a subset of $V(G)$ and r_γ is a vertex in $V(G) \setminus O_\gamma$. Informally, we interpret configuration γ by regarding each vertex in O_γ to have an *obstacle*, each vertex in $V(G) \setminus O_\gamma$ to have a *hole*, and vertex r_γ to have the robot. Note that the definition of a configuration requires that the robot to coincide with a hole. We use the convention to denote $V(G) \setminus O_\gamma$, the set of vertices with holes, by H_γ .

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A *robot move* on G is an ordered pair of adjacent vertices u, v of G , written as $u \Rightarrow v$. An *obstacle move* on G is also an ordered pair of adjacent vertices, but written differently as $u \rightarrow v$. A robot move $u \Rightarrow v$ is *applicable* to configuration γ if $r_\gamma = u$ and $v \in H_\gamma$. The *result of applying move $u \Rightarrow v$ to γ* , when applicable, is configuration (O_γ, v) . An obstacle move $u \rightarrow v$ is *applicable* to configuration γ if $u \in O_\gamma$ and $v \in H_\gamma \setminus \{r_\gamma\}$. The *result of applying move $u \rightarrow v$ to γ* , when applicable, is configuration $((O_\gamma \setminus u) \cup \{v\}, r_\gamma)$. A *move* on G is either a robot or an obstacle move on G . A move $u \rightarrow v$ or $u \Rightarrow v$ is said to be *from u to v* . We say that a move *involves* vertex v if the move is either to or from v . The *cost* of a move m from u to v , denoted by $\text{cost}_G(m)$, is the cost $\text{cost}_G(u, v)$ of the edge (u, v) .

A *plan* π on G is a possibly empty sequence of moves on G . We denote by $|\pi|$ the length of π , i.e., the number of moves of π , and by $\pi[i]$, $1 \leq i \leq |\pi|$, the i th move of π . We will use a similar notation for any sequence in general, without repeating the definition. Each i , $1 \leq i \leq |\pi|$, is called a *move index*, or simply an *index* of π ; it is an *obstacle move index* if $\pi[i]$ is an obstacle move and a *robot move index* if $\pi[i]$ is a robot move. We denote by I_π (I_π^{ob} , or I_π^{rob} , resp.) the set of move indices (obstacle move indices, or robot move indices, resp.) of π . The *cost* of a plan π on G , denote by $\text{cost}_G(\pi)$, is the sum of the costs of all the moves of π . When G is clear from the context, we will often drop the subscript G from notation cost_G , whether it be the cost of an edge, path, move, plan, or the cost of other entities we are yet to define. We also denote by $\text{ocost}_G(\pi)$ the sum of the costs of obstacle moves of π and by $\text{rcost}_G(\pi)$ the sum of the costs of robot moves of π . For two plans π_1 and π_2 , we denote by $\pi_1 \parallel \pi_2$ the concatenation of π_1 with π_2 , i.e., the sequence π_1 followed by π_2 . We say that a plan π is *applicable* to configuration γ if the moves of π are successively applicable to γ . More precisely, the definition is by induction as follows.

1. An empty plan is applicable to any configuration γ , and the result of the application is γ .
2. A plan $m \parallel \pi$, which consists of move m followed by plan π , is applicable to γ if m is applicable to γ and π is applicable to γ' , where γ' is the result of applying π to γ . The result of applying $m \parallel \pi$ to γ is defined to be the result of applying π to γ' .

We say that two plans π_1 and π_2 are *equivalent on configuration γ* if both of them are applicable to γ and the results of the applications are identical.

An *instance* of problem GMP1R is a triple (G, γ, t) where G is a weighted graph, γ is a configuration on G and t is a vertex of G . A plan π is a *solution* to instance (G, γ, t) if π is applicable to γ and $t = r_{\gamma'}$ where γ' is the result of applying π to γ , in other words, if plan π applied to γ brings the robot to t . An *optimal solution* is a solution with the minimum cost. Our goal is to find an optimal solution to the given instance.

It is often useful to view a group of obstacle moves without fixing the order among them. A *macro move* on G is a multiset of obstacle moves on G . The *cost* of a macro move M on G , $\text{cost}_G(M)$, is the sum of the costs of moves in M . We denote by $|M|$ the *size* of M , i.e., the number of moves of M , counted according to multiplicity. One may think of a macro move on G as a directed multigraph on $V(G)$: there is an edge from u to v for each move

$u \rightarrow v$ in the multiset. Let M be a macro move on G . For each vertex v of G , the *in-degree* of v in M is the number of moves in M that are *to* v . The *out-degree* of v in M is the number of moves in M that are *from* v . The *relative degree* of v in M is the out-degree of v minus the in-degree of v . We call a macro move M on G is *well-formed* if the relative degree of each vertex of G in M is either 1, 0, or -1 . A vertex of G is a *source* of M if its relative degree is 1; a *sink* if its relative degree is -1 . We say a source-sink pair (u, v) of M is *connected* if there is a directed path from u to v when we view M as a directed multigraph. We say macro moves M_1 and M_2 on G are *equivalent* if the relative degree of each vertex of G in M_1 is equal to its relative degree in M_2 . In the directed multigraph view, M_1 is equivalent to M_2 if one can be obtained from the other by adding and/or deleting cycles. We say macro move M_1 is *reducible* to macro move M_2 if M_2 is a subset of M_1 (as a multiset) and is equivalent to M_1 . The *reduced form* of macro move M is the smallest subset of M that is equivalent to M . We say a macro move M is *irreducible* if its reduced form is M itself.

For an arbitrary plan π and each subset I of I_π^{ob} , we denote by $\mathcal{M}_\pi = \{\pi[i] \mid i \in I\}$ the macro move that is the multiset of all the obstacle moves of π having their indices in I . In particular, we denote by $\mathcal{M}_\pi = \mathcal{M}_\pi[I_\pi^{ob}]$ the macro move consisting of all the obstacle moves of π . We call plan π a *sequencing* of macro move M , if it consists only of obstacle moves and $M = \mathcal{M}_\pi$. We say that a macro move M is applicable to configuration γ , if there is a sequencing of M that is applicable to γ .

Lemma 1 *Let M be an irreducible macro move on G and γ be a configuration on G . Then, M is applicable to γ if and only if*

- (1) *no move of M involves r_γ ,*
- (2) *M is well-formed, and*
- (3) *each source of M is in O_γ and each sink of M is in H_γ .*

Proof: That these conditions are necessary is obvious. The sufficiency of the conditions is proved by induction on the size of M . If M is empty, it is clearly applicable to γ . Suppose M is non-empty. Since M is irreducible and well-formed, M has at least one connected source-sink pair. By traversing from the source to the sink along the chain of moves of M , we can find a move $u \rightarrow v$ such that $u \in O_\gamma$ and $v \in H_\gamma$. Let γ' be the result of applying $u \rightarrow v$ to γ and let $M' = M \setminus u \rightarrow v$. Then, M' and γ' satisfies the above two conditions and therefore M' is applicable to γ' by the induction hypothesis. It follows that M is applicable to γ , completing the induction. \square

As a special case, if a macro move M is irreducible and has exactly one source-sink pair (u, v) , then the moves of M constitute a path P of G from u to v . In that case, we denote M by $u \xrightarrow{P} v$. When the path P is unique or clear from the context, we drop the it from the notation and write $u \rightarrow v$. In describing plans, we will allow inclusion of macro moves in the plan. This should be understood as a convention for the ease of description and a macro move is intended to denote a plan that is an appropriate sequencing of it.

Let γ and δ be configurations on G with $r_\gamma = r_\delta$ and $|O_\gamma| = |O_\delta|$. A *matching* μ from γ to δ is a bijection from O_γ to O_δ . A matching μ from γ to δ is *standard* if $\mu(v) = v$ for

every $v \in O_\gamma \cap O_\delta$. The *cost* of matching μ , $\text{cost}(\mu)$, is the sum of $\text{cost}(P_v)$ for $v \in O_\gamma$, where P_v is a path from v to μ in G with the minimum cost.

Lemma 2 *Let μ be a matching from configuration γ to δ and suppose that there is a minimum cost path from each $v \in O_\gamma$ to $\mu(v)$ that does not contain r_γ . Then, there is a plan π with $\text{cost}(\pi) = \text{cost}(\mu)$ such that the result of applying π to γ is δ . Conversely, if there is a plan π consisting of obstacle moves such that π is applicable to γ and results in δ , then there is a matching μ from γ to δ with $\text{cost}(\mu) \leq \text{cost}(\pi)$.*

Proof: For the first half, let M be the union of macro moves $v \xrightarrow{P_v} \mu(v)$ for all $v \in O_\gamma$, where P_v is the minimum cost path from v to $\mu(v)$ which does not contain r_γ . Then, M satisfies the conditions of Lemma 1 and therefore is applicable to γ . Take an appropriate sequencing of M as π . For the second half, suppose π is a plan applicable to γ and consider the macro move \mathcal{M}_π consisting of all the obstacle moves of π . The reduced form of \mathcal{M}_π can be decomposed into paths, each connecting a source-sink pair of \mathcal{M}_π . Fix such a decomposition and define μ by putting $\mu(u) = v$ for each source-sink pair (u, v) in the decomposition and $\mu(u) = u$ for each $u \in O_\gamma$ that is not a source of \mathcal{M}_π . \square

Let $i \in I_\pi^{ob}$ be an obstacle move index of π . Being slightly sloppy, we say i is *from* u (to v , resp.) if move $\pi[i]$ is from u (to v , resp.). We also say that i *involves* v if $\pi[i]$ involves v . Let $i, j \in I_\pi^{ob}$ be two obstacle move indices of π and v a vertex of G . We say i *connects to* j at v in π , if i is to v and j is from v . We say i *connects to* j in π , if i connects to j at some vertex v . We say i *obstacle-wise connects to* j in π , if j is the smallest move index larger than i such that i connects to j . When a plan is played out on a board with pebbles representing obstacles, obstacle-wise connections trace the motion of individual pebbles. We call $i \in I_\pi^{ob}$ *starting* if there is no j that obstacle-wise connects to i . We call $i \in I_\pi^{ob}$ *ending* if there is no j to which i obstacle-wise connects. A starting (ending, resp.) obstacle move index corresponds to the first (last, resp.) move applied to a pebble representing an obstacle. We say i *hole-wise connects to* j in π , if j is the largest move index smaller than i such that i connects to j . To make an analogous interpretation, we need to represent the holes, rather than obstacles, by pebbles: hole-wise connections *back trace* the motion of individual pebbles. A *thread* θ in plan π is a nonempty sequence of move indices of π such that $\theta[k]$ connects to $\theta[k+1]$ for $1 \leq k < |\theta|$. Each thread θ in plan π naturally corresponds to a walk on G , which we denote by $\text{walk}(\theta)$: the k th edge of $\text{walk}(\theta)$ is from u to v if $\pi[\theta[k]]$ is the move from u to v . We denote by $\text{init}(\theta)$ the initial vertex of $\text{walk}(\theta)$ and by $\text{fin}(\theta)$ the final vertex of $\text{walk}(\theta)$. Thread θ is *obstacle-wise* (*hole-wise*, resp.) if $\theta[k]$ obstacle-wise (hole-wise, resp.) connects to $\theta[k+1]$ for $1 \leq k < |\theta|$.

We call an obstacle-wise thread in π *maximal* if its first element is a starting index of π and its last element is an ending index of π . We call a thread an *MOT-chain* if it is a concatenation of one or more maximal obstacle-wise threads. An MOT-chain θ is called an MOT-cycle if $\text{init}(\theta) = \text{fin}(\theta)$; we regard two MOT-cycles as identical if they have the same set of maximal obstacle-wise threads and only differ in the initial vertex to start the thread representation. An MOT-chain θ is *acyclic* if it is not an MOT-cycle. We call an

MOT-chain θ of π *maximal* if either θ is a MOT-cycle or it is acyclic and there is no maximal obstacle thread θ' of π such that $\text{fin}(\theta') = \text{init}(\theta)$ or $\text{init}(\theta') = \text{fin}(\theta)$.

The following observations are obvious and will be used freely.

1. Any two distinct maximal obstacle-wise threads of π are disjoint. Any two distinct maximal hole-wise threads of π are disjoint. Any two distinct maximal MOT-chains are disjoint.
2. I_π^{ob} is the union of the maximal obstacle-wise threads of π . It is the union of the maximal hole-wise threads of π . It is also the union of the maximal MOT-chains of π .
3. Let γ be a configuration to which π is applicable and let δ be the result of applying π to γ . Then, for any maximal obstacle-wise thread θ , $\text{init}(\theta) \in O_\gamma$ and $\text{fin}(\theta) \in O_\delta$. For any maximal hole-wise trace τ , $\text{init}(\tau) \in H_\delta$ and $\text{fin}(\tau) \in H_\gamma$. Finally, for any acyclic maximal MOT-chain σ , $\text{init}(\sigma) \in O_\gamma \setminus O_\delta$ and $\text{fin}(\sigma) \in O_\delta \setminus O_\gamma$.

Finally, the *robot's walk* in plan π on G is the walk in G defined by the sequence of robot moves in π in an obvious manner.

3 Canonical plans for a tree

From now on, we assume that the graph G in the problem instance is a tree. The goal of this section is to define a class of plans, which we call *canonical plans*, and show that an optimal solution to any problem instance may be found in this class of plans.

Let u, v, w be vertices of G with $u \neq v$ and $w \neq v$. We say that w is in the *u-side* of v (in G) if w is in the connected component of $G \setminus \{v\}$ that contains u . We call a plan *monotonic* if the robot's walk in the plan is a path.

Lemma 3 *Let π be a monotonic plan on tree G applicable to configuration γ . Then there is a plan π' equivalent to π on γ with $\text{cost}(\pi') = \text{cost}(\pi)$, in which all the robot moves appear consecutively.*

Proof: Let the robot's walk in π be a path P from s to t . Let r_i denote the location of the robot after the first i moves of π are applied to γ , $0 \leq i \leq |\pi|$. We say that an obstacle move index $i \in I_\pi^{ob}$ is *behind* (*ahead of*, resp.) the robot if the vertices involved in move $\pi[i]$ are both in the *u-side* (*v-side*, resp.) of r_i . Permute π by first taking the obstacle moves with indices ahead of the robot, then the robot moves, and finally the obstacle moves with indices behind the robot, otherwise preserving the order in π ; let the result be π' . Let $\pi(v)$ ($\pi'(v)$, resp.) denote the sequence of moves of π (π' , resp.) that involves v , in the order of appearance in π (π' , resp.). It is easily verified that $\pi(v) = \pi'(v)$ for every vertex v of G . A straightforward induction based on this property shows that π and π' are equivalent on any configuration to which π is applicable. \square

It would be nice if we could confine ourselves to monotonic plans in our search for an optimal solution for a given instance. This is unfortunately not the case; we need to define a few ways of deviating from a monotonic motion of the robot.

Let P be a path of G from s to t . We call a vertex u of G a *sidestep vertex* of P if $u \notin V(P)$ and u is adjacent to an internal vertex of P , i.e., to a vertex in $V(P) \setminus \{s, t\}$.

Suppose P is of the form $s = v_0, v_1, \dots, v_k = t$. A sequence of robot moves is

- (1) an *advance* along P , if its a single move $v_{i-1} \Rightarrow v_i$ for some i , $1 \leq i \leq k$,
- (2) a *sidestep at v_i* along P , if it is a walk of the form $v_i \Rightarrow u \Rightarrow v_i$, where $1 \leq i \leq k - 1$ and u is a sidestep vertex of P adjacent to v_i , or
- (3) a *wiggle at v_i* along P , if it is a walk of the form $v_i \Rightarrow v_{i+1} \Rightarrow v_i \Rightarrow v_{i-1} \Rightarrow v_i$, where $1 \leq i \leq k - 1$.

We call a walk from s to t *quasi-monotonic* along P if it is a concatenation of advances, sidesteps, and wiggles along P , such that at most one sidestep or wiggle occurs at each v_i , $1 \leq i \leq k - 1$. We call a walk W from s to t in G *quasi-bitonic*, if there is some path P of G from s' to t such that s is on P (with s' possibly being equal to s) and W is a concatenation of the path from some s to s' and a quasi-monotonic walk from s' to t . We call a plan *quasi-monotonic* (*quasi-bitonic*, resp.) if the robot's walk in the plan is (quasi-monotonic, quasi-bitonic, resp.). Our first goal is to show that for any problem instance of GMP1R, where the graph is a tree, there is an optimal solution to the instance that is quasi-bitonic.

3.1 Path-plans

We start our analysis with a seemingly simple case, where the robot stays on a path. Let $s, t \in V(G)$ and P a path from s to t . Call a walk W from s to t *path-shaped* on P if (1) all the vertices visited by W is on P and (2) W does not visit t until the final step. Note that a path-shaped walk may contain any number of "turns" and thus may not be a path. We call a plan on G a *path-plan* if the robot's walk in the plan is path-shaped. We want to show that any path-plan can be transformed into an equivalent quasi-monotonic plan without increasing the cost.

Let π be a path-plan on tree G , in which the robot's walk is path-shaped on path P from s to t . Let u be a sidestep vertex of P , v the vertex of P adjacent to u , P_1 the path from s to u , and P_2 the path from v to t . We say that π is *decomposable at u* , if,

- (1) v is not adjacent to t , and
- (2) for each configuration γ to which π is applicable, π is equivalent to $\pi_1 \parallel u \Rightarrow v \parallel \pi_2$ on γ , where π_1 and π_2 are path-plans on P_1 and P_2 respectively, such that $\text{cost}(\pi_1) + \text{cost}(u \Rightarrow v) + \text{cost}(\pi_2) \leq \text{cost}(\pi)$.

Lemma 4 *Let π be a path-plan on tree G , in which the robot's walk is from s to t . Let $\text{prev}(t)$ denote the vertex adjacent to t in the s -side of t . Then, for every configuration γ to which π is applicable, there is a quasi-monotonic plan ρ equivalent to π on γ , with $\text{cost}(\rho) \leq \text{cost}(\pi)$, in which no sidestep or wiggle occurs at $\text{prev}(t)$.*

Proof: Let P denote the path from s to t . The proof is by induction on the length of P . If $|P| \leq 1$ then the result is obvious. Suppose $|P| = 2$ and $P = (s, v, t)$. The only way

in which π can avoid being monotonic is to “oscillate” the robot between s and v , because a path-plan does not allow the robot to visit t more than once. With a simple reordering of the obstacle moves of π , as in the proof of Lemma 3, we can remove that “oscillation” from the robot’s walk. Now suppose $|P| \geq 3$. If π is decomposable at some sidestep vertex of P , the result is easily obtained by applying the induction hypothesis to the two path-plans in the decomposition. In the following, we deal with the case where $|P| \geq 3$ and π is not decomposable.

Throughout the proof, we fix the initial configuration γ to which π is applied. Let γ_i , $0 \leq i \leq |\pi|$, be the result of applying the first i moves of π to γ . Let $\delta = \gamma_{|\pi|}$ denote the result of applying π to γ .

For each $v \in V(P) \setminus \{s\}$, let $\text{next}(v)$ denote the vertex immediately following v on P and, for each $v \in V(P) \setminus \{t\}$, let $\text{prev}(v)$ denote the vertex immediately preceding v on P . For each vertex u adjacent to some vertex of P , (1) let b_u denote the vertex on P adjacent to u , and (2) let T_u denote the subtree of G consisting of the vertices in the u -side of b_u . Let U denote the set of sidestep vertices of P . Let W denote the forest consisting of trees T_u for all $u \in U$. Let S denote the forest consisting of trees T_u for all u in the s -side of $\text{next}(s)$; let T denote the forest consisting of trees T_u for all u in the t -side of $\text{prev}(t)$. Note that the vertex sets $V(P)$, $V(S)$, $V(T)$, and $V(W)$ partition $V(G)$.

Let $i \in I_\pi^{ob}$ be an obstacle move index of π . We say i is *ahead of the robot* (*behind the robot*, resp.) if the vertices involved in move $\pi[i]$ are in the t -side (s -side, resp.) of r_{γ_i} , i.e., the robot’s location at the i th step in the application of π . Let $u \in U$ be a sidestep vertex. An *obstacle-critical pair* of π at u is a pair (i, j) of obstacle move indices of π such that i is from b_u to u and is behind the robot, j is from u to b_u and is ahead of the robot, and there is an obstacle-wise thread starting with i and ending with j . Similarly, a *hole-critical pair* of π at u is a pair (i, j) of move indices of π such that i is from u to b_u and is behind the robot, j is from b_u to u and is ahead of the robot, and there is an hole-wise thread starting with j and ending with i . We call a pair *critical* if it is obstacle- or hole-critical. Note that it must be $i < j$ for any critical pair (i, j) .

Observe that, if u is a sidestep vertex associated with a hole- or obstacle-critical pair, then each of the backward robot moves $\text{next}(b_u) \Rightarrow b_u$ and $b_u \Rightarrow \text{prev}(b_u)$ must appear in π at least once. In particular, since the definition of a path-walk forbids the move $t \Rightarrow \text{prev}(t)$, this implies that u is such that $b_u \neq \text{prev}(t)$. Define $U' \subseteq U$ by $U' = \{u \in U \mid b_u \neq \text{prev}(t)\}$; it is the set of sidestep vertices that are possibly associated with critical pairs.

The proofs of the following three claims will be given later.

Claim 1 *If there is an obstacle-critical pair of π at some sidestep vertex u , then π is decomposable at u .*

Claim 2 *Suppose there are two distinct hole-critical pairs of π , one at u and the other at u' such that $b_u = b_{u'}$ (with u and u' possibly being identical). Then π is decomposable at u or u' .*

Claim 3 *Suppose there are two distinct hole-critical pairs of π , at u and at u' . If $b_{u'} = \text{next}(b_u)$ and furthermore the backward robot move $b_{u'} \Rightarrow b_u$ appears at most once in π , then π is decomposable at u or u' .*

The following claim is used to simplify our problem.

Claim 4 *The given plan π is equivalent to $\pi_1 \parallel \pi' \parallel \pi_2$ for some π_1, π_2 , and π' such that π_1 and π_2 consist only of obstacle moves, the macro move $\mathcal{M}_{\pi'}$ (i.e., the multiset of all the obstacle moves of π') does not have any sink in T , and $\text{cost}(\pi_1) + \text{cost}(\pi') + \text{cost}(\pi_2) \leq \text{cost}(\pi)$.*

Proof: Let Σ denote the set of acyclic maximal MOT-chains of π whose final vertices are in T . Let $\Sigma' \subseteq \Sigma$ be the set of acyclic maximal MOT-chains belonging to Σ whose initial vertices are in S . Let σ be a maximal MOT-chain in Σ' . Considering how the MOT-chain interacts with the robot's move, there must be some sidestep vertex $u \in U$ and a pair (i, j) of move indices appearing in σ , i appearing in σ before j , such that i is from b_u to u and behind the robot, j is from u to b_u and ahead of the robot, and for any i' appearing in σ between i and j , $\pi[i']$ does not involve b_u . If i and j belong to the same obstacle-wise thread in σ , then by Claim 1 π is decomposable, contradicting our assumption. Therefore, i and j must belong to distinct obstacle-wise threads in σ . It follows that we can express σ as a concatenation of two MOT-chains $\text{left}(\sigma)$ and $\text{right}(\sigma)$ such that $\text{fin}(\text{left}(\sigma)) = \text{init}(\text{right}(\sigma))$ is a vertex in T_u . Let $\Sigma_1 = (\Sigma \setminus \Sigma') \cup \{\text{right}(\sigma) \mid \sigma \in \Sigma'\}$ and $\Sigma_2 = \{\text{left}(\sigma) \mid \sigma \in \Sigma'\}$. We set π_1 and π_2 to be appropriate sequencings of macro moves $\bigcup_{\sigma \in \Sigma_1} \text{init}(\sigma) \rightarrow \text{fin}(\sigma)$ and $\bigcup_{\sigma \in \Sigma_2} \text{init}(\sigma) \rightarrow \text{fin}(\sigma)$, respectively, and set π' to be the plan obtained from π by removing $\pi[i]$ for every i that appears in some MOT-chain belonging to Σ . It is easily verified that $\pi_1 \parallel \pi' \parallel \pi_2$ is equivalent to π on γ . The cost condition is also obviously satisfied, because the multiset of obstacle moves of $\pi_1 \parallel \pi' \parallel \pi_2$ is a subset of that of π . \square

In the following, we assume, without loss of generality owing to the above claim, that \mathcal{M}_π does not have any sink in T . For each vertex v of $P \cup T$ that has an obstacle in γ , i.e., $v \in V(P \cup T) \cap O_\gamma$, define a thread $\text{evac}(v)$ of π , called the *evacuation thread* for v , as follows. We need auxiliary definitions. For move indices $i, j \in I_\pi^{\text{ob}}$, we say that i *firmly connects to* j if either

- (1) i obstacle-wise connects to j at some vertex in $P \cup T$, or
- (2) i connects to j at some vertex in T , i is an ending index (i.e., does not obstacle-wise connect to any index), and j is a starting index (i.e., no index obstacle-wise connects to j).

Note that at most one i firmly connects to each j . For each $i \in I_\pi^{\text{ob}}$ such that i involves a vertex in $P \cup T$, define a thread $\text{othread}(i)$ inductively as follows: $\text{othread}(i)$ is singleton i if i does not firmly connect to any index; $\text{othread}(i)$ is i followed by $\text{othread}(j)$ if i firmly connects to j . Note the the last element of $\text{othread}(i)$ is to a vertex in P , a sidestep vertex of P , or a vertex adjacent to s .

Now, $\text{evac}(v)$ consists of one or more *segments* possibly followed by a *coda*. Each segment is thread $\text{othread}(i)$ for some move index i and the coda is either empty or a hole-wise thread. The first segment of $\text{evac}(v)$ is $\text{othread}(i_v)$ where i_v is the move index that is starting and

is from v . Suppose the first k segments of $\text{evac}(v)$ has been defined for $k \geq 1$. Let j be the last element of this k th segment. If j is to a vertex on P then $\text{evac}(v)$ is already completed: it has k segments and no coda. Otherwise, j must be to a vertex u that is either a sidestep vertex or a vertex adjacent to s and not on P . Let τ_k be the longest hole-wise thread that starts with j . If no move index of τ_k involves b_u (i.e., $\text{walk}(\tau_k)$ stays within T_u), then we let $\text{evac}(v)$ end with τ_k as the coda. Otherwise, let j' be the first element of τ_k such that j' is from u to b_u . We take $\text{othread}(j')$ as the $(k+1)$ st segment of $\text{evac}(v)$ and continue the inductive definition.

Note that (1) $\text{evac}(v)$ is a finite sequence for every $v \in V(P \cup T) \cap O_\gamma$ and (2) $\text{evac}(v)$ and $\text{evac}(v')$ are disjoint for every distinct pair $v, v' \in V(P \cup T) \cap O_\gamma$. This follows easily from the fact that for each $i \in I_\pi$ there is at most one i' (and there is none if i is a starting move index from some $v \in V(P \cup T) \cap O_\gamma$) that can immediately precede i in any evacuation thread.

In each segment of $\text{evac}(v)$, all the move indices are either entirely ahead of the robot or entirely behind the robot. We call a segment in the first case an A-segment and in the second case a B-segment. Call an evacuation thread *critical* if its last move is to a vertex in $P \cup S$. Note that the last segment of a critical evacuation thread is a B-segment. Since any critical evacuation thread starts with an A-segment, it must contain an A-segment τ immediately followed by a B-segment τ' . Let i be the last element of τ and i' the first element of τ' . Then (i', i) is a hole-critical pair.

Claim 5 *Let $\text{evac}(v)$ be an evacuation thread, let τ be an arbitrary A-segment of $\text{evac}(v)$ and suppose a hole-critical pair (i, j) at sidestep vertex u appears in $\text{evac}(v)$. Suppose furthermore that j is either the last element of τ or appears after τ in $\text{evac}(v)$. Suppose that $\text{walk}(\tau)$ does not visit any vertex in the $\text{next}(\text{next}(b_u))$ -side of $\text{next}(b_u)$. Let $l = |\tau|$. Then, $\tau[l] > i$ implies that τ is not the first segment of $\text{evac}(v)$ and that $\tau[1] > i$.*

Proof: Before anything, note that $\text{next}(\text{next}(b_u))$ is well defined because u must be in U' . The proof is by contradiction. Suppose first that $\tau[l] > i$ and $\tau[1] < i$. By the assumption that $\text{walk}(\tau)$ does not visit any vertex in the $\text{next}(\text{next}(b_u))$ -side of $\text{next}(b_u)$, move index $\tau[1]$ must be to a vertex in the $\text{next}(b_u)$ -side of $\text{next}(\text{next}(b_u))$. Then the following sequence of events happen in the application of π . Move $\pi[\tau[1]]$ puts an obstacle on P in the t -side of the robot, which stays on $P \cup T$ until move $\pi[\tau[l]]$ takes it off $P \cup T$. Between these two moves, a robot move $\pi[i']$, for some $\tau[1] < i' < i$, moves the robot to $\text{next}(b_u)$. But this is impossible because $\text{walk}(\tau)$ stays in the $\text{next}(b_u)$ -side of $\text{next}(\text{next}(b_u))$. We get a similar contradiction if we suppose $\tau[l] > i$ and τ is the first segment of $\text{evac}(v)$. \square

The following claim is almost symmetric to the above and its proof is similar.

Claim 6 *Let $\text{evac}(v)$ be an evacuation thread that contains a hole-critical pair (i, j) at some sidestep vertex u . Let τ be an arbitrary B-segment of $\text{evac}(v)$ such that τ appears in $\text{evac}(v)$ after i , possibly $\tau[1]$ being equal to i . Suppose that either (1) $\text{prev}(b_u) = s$ or (2) $\text{prev}(b_u) \neq s$ and $\text{walk}(\tau)$ does not visit any vertex in the $\text{prev}(\text{prev}(b_u))$ -side of $\text{prev}(b_u)$. Let $l = |\tau|$. Then, $\tau[1] < j$ implies that τ is not the last segment of $\text{evac}(v)$ and that $\tau[l] < j$.*

Suppose a hole-critical pair (i, j) at u appears in the evacuation sequence $\text{evac}(v)$. We call the pair (i, j) *forward-safe* if the part of the thread $\text{evac}(v)$ before i visits $\text{next}(\text{next}(b_u))$. We call it *backward-safe* if either

- (1) the final vertex of $\text{evac}(v)$ is in S , or
- (2) $b_u \neq \text{prev}(s)$ and the part of the thread $\text{evac}(v)$ after j visits $\text{prev}(\text{prev}(b_u))$.

The following is a key claim in constructing our plan δ .

Claim 7 *Let $v \in O_\gamma$ be a vertex in $P \cup T$ and suppose the evacuation tread $\text{evac}(v)$ is critical. Then, $\text{evac}(v)$ contains a hole-critical pair that is backward- and forward-safe at the same time.*

Proof: We have already noted that any critical evacuation sequence contains a hole-critical pair. We first show that at least hole-critical pair must be backward-safe, namely the last one. Let (i_1, j_1) be the last hole-critical pair and suppose it is not backward-safe. Let τ_1, τ_2, \dots , be the segments appearing after i_1 in $\text{evac}(v)$, with τ_1 starting with i_1 . Since (i_1, j_1) is the last hole-critical pair and $\text{evac}(v)$ ends in $P \cup S$, these segments τ_1, \dots are all B -segments. Let i'_1 be the last element of τ_1 . By Claim 6, τ_1 is not the last segment of $\text{evac}(v)$ and $i'_1 < j_1$. Let i_2 be the first element of τ_2 . Since there is a hole-wise thread starting with i'_1 and ending with i_2 , we have $i_2 < i'_1 < j_1$. Proceeding by induction, we have a contradicting conclusion that τ_k is not the last segment for every k . Therefore, (i_1, j_1) must be backward-safe.

Now, let (i_0, j_0) be the first hole-critical pair in $\text{evac}(v)$ that is backward-safe. We claim that it must also be forward-safe. Suppose to the contrary that it is not forward-safe. We first show by induction that, for every hole-critical pair (i, j) preceding (i_0, j_0) in $\text{evac}(v)$ we have $i_0 < j$. The base case $(i, j) = (i_0, j_0)$ is trivial since $i < j$ for any critical pair. Suppose the claim holds for a hole-critical pair (i, j) that precedes (i_0, j_0) and let (i', j') be the hole-critical pair that immediately precedes (i, j) . Then, between j' and i in $\text{evac}(v)$, there is a consecutive series of B -segments and a consecutive series of A -segments. Let τ be the last of those B -segments and τ' be the first of those A -segments. Repeatedly applying Claim 5 to those A -segments based on the assumption that (i_0, j_0) is not forward-safe, we obtain $i_0 < \tau'[1]$. On the other hand, repeatedly applying Claim 6 to those B -segments based on the assumption that (i', j') is not backward-safe, we have $\tau[l] < j'$, where $l = |\tau|$. But clearly $\tau'[1] < \tau[l]$ because there is a hole-wise thread starting with $\tau[l]$ and ending with $\tau'[1]$. Combining all of these inequalities, we obtain $i_0 < j'$, completing the induction. Now, Claim 5 applied to the A -segments before the first critical pair implies, under our assumption that (i_0, j_0) is not forward-safe, that none of those A -segments can be the first segment of $\text{evac}(v)$, a contradiction. Therefore, the pair (i_0, j_0) must be forward-safe. \square

Let $V_o = V(P \cup T) \cap O_\gamma$ be the set of vertices in $P \cup T$ that have an obstacle initially. Let I_{evac} be the subset of I_π^{ob} defined by $I_{\text{evac}} = \bigcup_{v \in V_o} \text{evac}(v)$, where we regard thread $\text{evac}(v)$ as a set of move indices. Let I_{rem} be the set of remaining move indices: $I_{\text{rem}} = I_\pi^{ob} \setminus I_{\text{evac}}$. Clearly, the sources of macro move $\mathcal{M}_\pi[I_{\text{evac}}]$ contain all the sources of macro move \mathcal{M}_π in T . Moreover, from the definition of the evacuation thread, macro move $\mathcal{M}_\pi[I_{\text{evac}}]$ does not have a sink in T . Combined with the assumption that \mathcal{M}_π does not have a sink in T , it

follows that the macro move $\mathcal{M}_\pi[I_{rem}]$ has neither a source nor a sink in T . This means, in informal terms, that we may postpone the application of the moves in I_{rem} until the robot reaches its destination t .

Let V_c be the subset of V_o consisting of all the vertices v such that $\text{evac}(v)$ is critical. For each $v \in V_c$, $\text{evac}(v)$ has a backward- and forward-safe hole-critical pair, by Claim 7; fix one such hole-critical pair and let u_v denote the sidestep vertex associated with it. Let V'_c denote the subset of V_c consisting of all the vertices v such that $b_{u_v} = \text{next}(s)$. For each $v \in V_c \setminus V'_c$, decompose $\text{evac}(v)$ into four parts as $\text{evac}(v) = \text{evac}_1(v) \parallel \text{evac}_2(v) \parallel \text{evac}_3(v) \parallel \text{evac}_4(v)$, so that $\text{fin}(\text{evac}_1(v)) = \text{next}(\text{next}(b_{u_v}))$, $\text{fin}(\text{evac}_2(v)) = u_v$, and $\text{fin}(\text{evac}_3(v)) = \text{prev}(\text{prev}(b_{u_v}))$. Similarly for each $v \in V'_c$, decompose $\text{evac}(v)$ into three parts as $\text{evac}(v) = \text{evac}_1(v) \parallel \text{evac}_2(v) \parallel \text{evac}_3(v)$, so that $\text{fin}(\text{evac}_1(v)) = \text{next}(\text{next}(b_{u_v}))$, $\text{fin}(\text{evac}_2(v)) = u_v$. Note that $\text{fin}(\text{evac}_3(v)) = \text{fin}(\text{evac}(v))$ is in S in this case, by the definition of backward-safety.

Our plan ρ will consist of several parts we are going to define. Let I_{pre} be the subset of I_{evac} defined by $I_{pre} = \bigcup_{v \in V_o \setminus V_c} \text{evac}(v) \cup \bigcup_{v \in V_c} \text{evac}_1(v)$. Let ρ_0 be the plan consisting of the reduced form of the macro move $\mathcal{M}_\pi[I_{pre}]$. Plan ρ_0 is applicable to γ because the sources of $\mathcal{M}_\pi[I_{pre}]$ are in $(P \setminus \{s\}) \cup T$ and its sinks are in $(P \setminus \{s\}) \cup W$; let δ_0 denote the result of applying ρ_0 to γ . Let $V_c = \{v_1, \dots, v_K\}$, let $u_i = u(v_i)$ and $b_i = b_{u_i}$, $1 \leq i \leq K$. Relabeling if necessary, we may assume that b_1, \dots, b_K appear on P in this order when we scan from s to t . Define a plan ρ_i and a configuration δ_i , $1 \leq i \leq K$, inductively as follows. Configuration δ_0 is already defined above. Suppose δ_{i-1} has been defined. Let ρ_i^1 denote the minimal sequence of robot moves that brings the robot from its position $r_{\delta_{i-1}}$ in δ_{i-1} to $\text{next}(b_i)$. Let ρ_i^2 denote the reduced form of the macro move $\mathcal{M}_\pi[\text{evac}_2(v_i)]$. Let ρ_i^3 denote the reduced form of the macro move $\mathcal{M}_\pi[\text{evac}_3(v_i)]$. Let ρ_i^4 denote the sequence of robot moves $\text{next}(b_i) \Rightarrow b_i \parallel b_i \Rightarrow \text{prev}(b_i)$. If u_i has an obstacle in δ_{i-1} , i.e., $u_i \in O_{\delta_{i-1}}$, then we put

$$\rho_i = \rho_i^1 \parallel \rho_i^3 \parallel \rho_i^4 \parallel \rho_i^2;$$

otherwise we put

$$\rho_i = \rho_i^2 \parallel \rho_i^1 \parallel \rho_i^3 \parallel \rho_i^4.$$

It can be easily verified by induction that ρ_i is applicable to δ_{i-1} ; let δ_i be the result of applying ρ_i to δ_{i-1} . Note that, in δ_i , no vertex on the path from $\text{prev}(b_i)$ (or s if $i = 0$) to $\text{next}(b_{i+1})$ (or t if $i = K$) has an obstacle.

Finally, let ρ_{K+1} be the sequence of robot moves that brings the robot from $\text{prev}(b_K)$ to t and let ρ_{K+2} be the reduced form of the macro move $\mathcal{M}_\pi[I'_{rem}]$ where I'_{rem} is defined by $I'_{rem} = I_{rem} \cup \bigcup_{v \in V_c \setminus V'_c} \text{evac}_4(v)$. Plan ρ_{K+1} is applicable to δ_K since the path from b_K to t is clear of obstacles. To the result of this application, ρ_{K+2} is applicable because (1) the macro move consisting of the obstacle moves in $\rho_1 \parallel \dots \parallel \rho_K$ is equivalent to macro move $\mathcal{M}_\pi[I_\pi^{ob} \setminus I_{rem}]$ and (2) all the sources and sinks of $\mathcal{M}_\pi[I'_{rem}]$ are in the s -side of t . Our plan ρ is defined by $\rho_0 \parallel \rho_1 \parallel \dots \parallel \rho_{K+2}$. Clearly, ρ is applicable to γ .

If we review how the macro moves of ρ are derived, we see that macro move \mathcal{M}_π is decomposed into disjoint macro moves and the reduced form of each of them is included in ρ . Therefore, macro move \mathcal{M}_ρ is a subset of, and is equivalent to, \mathcal{M}_π . Since moreover ρ

is applicable to γ and brings the robot from s to t , ρ is equivalent to π on γ . Clearly the cost of obstacle moves of ρ is no greater than that of γ , because \mathcal{M}_ρ is a subset of \mathcal{M}_π . It remains to show that the cost of robot moves of ρ is no greater than that of π . Suppose a backward robot move from $\text{next}(v) \Rightarrow v$ for some vertex on $P \setminus t$ appears in ρ . Then, there is a critical pair at some u with $b_u = v$ or $b_u = \text{next}(v)$, which implies that π must also contain the same backward robot move. Assume furthermore that $\text{next}(v) \Rightarrow v$ appears twice in ρ . Then, there are critical pairs at some u and u' , with $b_u = v$ and $b_{u'} = \text{next}(v)$. This implies, by Claim 3 that the same robot move appears twice in π as well. Since no backward robot move appears more than twice in ρ , we may conclude that the multiset of robot moves occurring in ρ is the subset of that in π . Therefore, the cost of ρ is no greater than that of π . This completes the proof of Lemma 4, except for the proofs of Claims 1, 2, and 3. \square

In order to prove Claims 1, 2 and 3, we need the following lemma.

Lemma 5 *Let v be a vertex of tree G , let v_1, v_2 , and u be distinct vertices adjacent to v . Let γ and δ be two configurations of G such that*

- (1) *None of v_1, v_2 and v has an obstacle in γ or in δ , i.e., $\{v_1, v_2, v\} \subseteq H_\gamma \cap H_\delta$,*
- (2) *$r_\gamma = v_1$ and $r_\delta = v_2$, and*
- (3) *there is a matching from γ to δ .*

Let μ be a minimum cost matching from γ to δ . Then there is a plan ρ with robot's walk $v_1 \Rightarrow v \Rightarrow u \Rightarrow v \Rightarrow v_2$, such that applying ρ to γ results in δ and the total cost of obstacle moves in ρ is $\text{ocost}(\rho) = \text{cost}(\mu) + 2 \text{cost}(v_1, v) + 2 \text{cost}(u, v) + 2 \text{cost}(v_2, v)$. Moreover, there is a plan ρ as above with

$$\begin{aligned} \text{ocost}(\rho) &= \text{cost}(\mu) + 2 \text{cost}(v_1, v) \text{ if } u \in H_\gamma; \\ \text{ocost}(\rho) &= \text{cost}(\mu) + 2 \text{cost}(v_2, v) \text{ if } u \in H_\delta; \\ \text{ocost}(\rho) &= \text{cost}(\mu) \text{ if } u \in H_\gamma \cap H_\delta. \end{aligned}$$

Proof: We may assume without loss of generality that μ is standard, i.e., $\mu(w) = w$ for every $w \in O_\gamma \cap O_\delta$. For each neighbor v' of v , let $X(v')$ denote the set of vertices $w \in O_\gamma \setminus O_\delta$ such that there is a path from w to $\mu(w)$ in $G \setminus \{v'\}$.

Our plan ρ consists of robot moves $v_1 \Rightarrow v, v \Rightarrow u, u \Rightarrow v, v \Rightarrow v_2$ together with obstacle moves defined based on the matching μ . Let ρ_1 (ρ_u, ρ_2 , resp.) be an obstacle plan consisting of all the macro moves $w \rightarrow \mu(w)$, $w \in X(v_1)$ ($X(u), X(v_2)$, resp.) in an arbitrary order. Note that we have $X(v_1) \cup X(u) \cup X(v_2) = O_\gamma$, so ρ_1, ρ_u , and ρ_2 together contain all the macro moves $w \rightarrow \mu(w)$, $w \in O_\gamma \setminus O_\delta$.

Let us start with the simplest case, where $u \in H_\gamma \cap H_\delta$. Then ρ is simply defined as

$$\rho_1 \parallel v_1 \Rightarrow v \parallel v \Rightarrow u \parallel \rho_u \parallel u \Rightarrow v \parallel v \Rightarrow v_2 \parallel \rho_2,$$

which clearly satisfies the requirements and, in particular, satisfies $\text{ocost}(\rho) = \text{cost}(\mu)$.

Now suppose that $u \in H_\gamma \setminus H_\delta$. Since v_2 must be in $X(v_1) \cup X(u)$, the above plan still works unless $\mu(v_2) = u$. Suppose $\mu(v_2) = u$. Let ρ'_1 be obtained from ρ_1 by removing the macro move $v_2 \rightarrow u$. Our plan ρ in this case is

$$\rho'_1 \parallel v_1 \Rightarrow v \parallel v \Rightarrow u \parallel \rho_u \parallel v_2 \rightarrow v_1 \parallel u \Rightarrow v \parallel v \Rightarrow v_2 \parallel v_1 \rightarrow u \parallel \rho_2.$$

A straightforward tracing shows that ρ is applicable to γ and results in δ . Moreover, $\text{ocost}(\rho) = \text{cost}(\mu) - \text{cost}(v_2 \rightarrow u) + \text{cost}(v_2 \rightarrow v_1) + \text{cost}(v_1 \rightarrow u) = \text{cost}(\mu) + 2 \text{cost}(v_1, v)$. The case where $u \in H_\delta \setminus H_\gamma$ is similar.

Finally, suppose $u \notin H_\delta \cup H_\gamma$. Our plan ρ is

$$u \rightarrow v_2 \parallel \rho_1 \parallel v_1 \Rightarrow v \parallel v \Rightarrow u \parallel v_2 \rightarrow v_1 \parallel \rho_u \parallel v_2 \rightarrow v_1 \parallel u \Rightarrow v \parallel v \Rightarrow v_2 v_1 \rightarrow u \parallel \rho_2.$$

It is again straightforward to verify that ρ is applicable to γ and results in δ . As for the cost, $\text{ocost}(\rho) = \text{cost}(\mu) + \text{cost}(u \rightarrow v_2) + \text{cost}(v_2 \rightarrow v_1) + \text{cost}(v_1 \rightarrow u) = \text{cost}(\mu) + 2 \text{cost}(v, v_1) + 2 \text{cost}(v, u) + 2 \text{cost}(v, v_2)$. \square

Proof of Claim 1: Suppose π is a path-plan that has an obstacle-critical pair (i, j) at some sidestep vertex u . We use the notation in the proof of Lemma 4. Let h be the smallest integer such that $\pi[h]$ is the robot move from b_u to $\text{next}(b_u)$. By Lemma 3 we may assume without loss of generality that $\pi[h-1]$ is the robot move from $\text{prev}(b_u)$ to b_u . Similarly, let k be the largest integer such that $\pi[k]$ is the robot move from $\text{prev}(b_u)$ to b_u ; we may assume that $\pi[k+1]$ is the robot move from b_u to $\text{next}(b_u)$. From the definition of an obstacle-critical pair, it is easily seen that $h < i < j < k$. We concentrate on the plan π' consisting of the moves $\pi[h-1], \pi[h], \dots, \pi[k+1]$. Plan π' is applied to $\gamma' = \gamma_{h-2}$ and results in $\delta' = \gamma_{k+1}$. We have a few cases to consider.

CASE 1: There are move indices i' and j' , $h < i' \neq j' < k$, that are distinct from i and j such that i' is from b_u to u and j' is from u to b_u . Let μ be an arbitrary minimum cost matching from γ' to δ' . Since macro move $\mathcal{M}_{\pi'}$ is reducible to a macro move in which two instances of $u \rightarrow b_u$ and two instances of $b_u \rightarrow u$ are removed, we have $\text{cost}(\mu) \leq \text{ocost}(\pi') - 4 \text{cost}(u, b_u)$. Applying Lemma 5, there is a plan ρ' equivalent to π' , in which the robot's walk is $\text{prev}(b_u) \Rightarrow b_u \Rightarrow u \Rightarrow b_u \Rightarrow \text{next}(b_u)$, with

$$\begin{aligned} \text{ocost}(\rho') &= \text{cost}(\mu) + 2 \text{cost}(\text{prev}(b_u), b_u) + 2 \text{cost}(u, b_u) + 2 \text{cost}(\text{next}(b_u), b_u) \\ &\leq \text{ocost}(\pi') + 2 \text{cost}(\text{prev}(b_u), b_u) + 2 \text{cost}(\text{next}(b_u), b_u) - 2 \text{cost}(u, b_u). \end{aligned}$$

On the other hand, we have $\text{rcost}(\rho') \leq \text{rcost}(\pi') + 2 \text{cost}(u, b_u) - 2 \text{cost}(\text{prev}(b_u), b_u) - 2 \text{cost}(\text{next}(b_u), b_u)$. Therefore, by replacing π' by ρ' in π we obtain a plan ρ equivalent to π with no greater cost. Cut ρ after the robot move $b_u \Rightarrow u$ and we obtain the required decomposition at u .

CASE 2: There is no move index $j' \neq i$, $h < j' < k$, such that j' is from u to b_u . Let τ denote the longest hole-wise thread of π starting with i and consisting solely of elements larger than h . Since τ cannot contain a move index that is from u to b_u , $\text{walk}(\tau)$ stays within T_u , except at its initial vertex b_u . Noting that $\text{fin}(\tau)$ must have a hole in γ' , let γ'' be the result of applying macro move $u \rightarrow \text{fin}(\tau)$ to γ' and let μ' be an arbitrary minimum cost matching from γ'' to δ' . Let $I \subseteq I_\pi^{\text{ob}}$ be defined by $I = \{l \in I_\pi^{\text{ob}} \mid h < l < k, l \notin \tau \cup \{j\}\}$. Then, macro move $\mathcal{M}_\pi[I]$ is applicable to γ'' and results in δ . Therefore, we have $\text{cost}(\mu') \leq \text{ocost}(\pi') - \text{cost}(u \rightarrow \text{fin}(\tau)) - 2 \text{cost}(u, b_u)$. Applying Lemma 5 and obtain a plan ρ'' that sends γ'' to δ' such that the robot's walk in ρ'' is the same as in ρ' above. Since u has a hole in γ' , we may use the second case of the lemma, obtaining

$\text{ocost}(\rho'') \leq \text{cost}(\mu') + 2 \text{cost}(\text{prev}(b_u), b_u)$, and hence by the above inequality,

$$\text{ocost}(\rho'') \leq \text{ocost}(\pi') - \text{cost}(u \rightarrow \text{fin}(\tau)) - 2 \text{cost}(u, b_u) + 2 \text{cost}(\text{prev}(b_u), b_u).$$

Taking into account the difference of the robot cost, we have

$$\text{cost}(\rho'') \leq \text{cost}(\pi') - \text{cost}(u \rightarrow \text{fin}(\tau)).$$

By replacing π' by $u \rightarrow \text{fin}(\tau) \parallel \rho''$ in π , we obtain a plan equivalent to π and with no greater cost than π . Cut this plan immediately after the robot move to u to obtain the required decomposition of π .

CASE 3: There is no move index $i' \neq j$, $h < i' < k$, such that i' is from b_u to u . Let σ denote the longest hole-wise thread ending with j and consisting solely of elements smaller than k . Since σ cannot contain a move index that is from b_u to u , $\text{walk}(\sigma)$ stays within T_u , except at its final vertex b_u . Noting that $\text{init}(\sigma)$ must have a hole in δ' , let δ'' be the result of applying macro move $u \rightarrow \text{init}(\sigma)$ to δ . The rest of the proof proceeds similarly to Case 2, applying Lemma 5 to γ' and δ'' . \square

The proofs of Claim 2 and 3 are similar to each other. We prove Claim 3 and omit the simpler proof of Claim 2.

Proof of Claim 3: From the assumptions that there is a hole-critical pair at each of u and u' , that $b_{u'} = \text{next}(b_u)$, and that the backward robot move $b_{u'} \Rightarrow b_u$ appears at most once in π , it follows that the robot move immediately before $b_{u'} \Rightarrow b_u$ is $\text{next}(b_{u'}) \Rightarrow b_{u'}$ and the robot move immediately after $b_{u'} \Rightarrow b_u$ is $b_u \Rightarrow \text{prev}(b_u)$. Informally, the robot does not “turn around” at b_u or $b_{u'}$. Let h be the smallest integer such that $\pi[h]$ is the forward robot move $b_u \Rightarrow b_{u'}$ and k be the largest such integer. By Lemma 3, we may assume that both $\pi[h-1] \parallel \pi[h] \parallel \pi[h+1]$ and $\pi[k-1] \parallel \pi[k] \parallel \pi[k+1]$ comprise a robot walk from $\text{prev}(b_u)$ to $\text{next}(b_{u'})$. Suppose first that $\text{cost}(u, b_u) \leq \text{cost}(u', b_{u'})$. Let π' be the part of π starting with the $(h-1)$ st move and ending with the k th. Note π' applies to γ_{h-2} and results in γ_k . Let μ be an arbitrary minimum cost matching from γ_{h-2} to γ_k . By our assumptions of the presence of critical pairs, we have $\text{ocost}(\pi') \geq \text{cost}(\mu) + 2(\text{cost}(u, b_u) + \text{cost}(u', b_{u'})) \geq \text{cost}(\mu) + 4 \text{cost}(u, b_u)$. The rest of the proof proceeds similarly to Case 1 of the proof of Claim 1. The other case where $\text{cost}(u, b_u) \geq \text{cost}(u', b_{u'})$ is similar: instead of π' defined above, deal with the part of π starting with the h th move and ending with the $(k+1)$ st. \square

Let us turn our attention to the global structure of an optimal solution for a problem instance. The *robot trajectory* of a plan π for G is the subgraph of G induced by the edges traversed by the robot in the application of π . Let P be a path of G . A *P -caterpillar* of G is a subgraph of G consisting of P and at most one vertex in $V(G) \setminus V(P)$ adjacent to each internal vertex of P . Thus, the degree of each vertex of a P -caterpillar is either 1, 2, or 3: we call a vertex with degree 3 a *joint* of the caterpillar. When P is a path from u to v , a P -caterpillar is also called a *u - v caterpillar*. The *tail* of a u - v caterpillar is defined to be the maximal subpath of the path from u to v that starts from u and does not include a joint except possibly for the vertex adjacent to u .

Lemma 6 *For any problem instance (G, γ, t) where G is a tree, there is a optimal solution for the instance such that its robot trajectory is an s' - t caterpillar for some s' that contains $s = r_\gamma$ in its tail.*

To prove this lemma, we need the following lemma that is used to “prune” long branches of a robot trajectory.

Lemma 7 *Let v be a vertex of tree G with degree at least 3 and let v_1 and v_2 be distinct vertices adjacent to v . Let π be a plan on G of the form $v_1 \Rightarrow v \parallel \pi' \parallel v \Rightarrow v_2$, where π' is a plan in which one of the robot moves is $v \Rightarrow u$ for some $u \notin \{v_1, v_2\}$, the first robot move is $v \Rightarrow u_1$ for some $u_1 \neq v_1$, the last robot move is $u_2 \Rightarrow v$ for some $u_2 \neq v_2$. Then, for each configuration γ to which π is applicable, there is a plan ρ equivalent to π on γ , with cost no greater than π , such that the robot’s walk in ρ is $v_1 \Rightarrow v \Rightarrow u \Rightarrow v \Rightarrow v_2$.*

Proof: Let δ be the result of applying π to γ and let μ be an arbitrary minimum cost matching from γ to δ . Define $X(v_1)$, $X(u)$, $X(v_2)$, ρ_1 , ρ_u and ρ_2 exactly in the same way as in the above proof of Lemma 5.

Suppose first that $u_1 = u$. There are several cases to consider. The simplest case is when $\mu(x) \neq u$ for every $x \in X(v_1)$. Then, our final plan ρ is $\rho_1 \parallel v_1 \Rightarrow v \parallel v \Rightarrow u \parallel \rho_u \parallel u \Rightarrow v \parallel v \Rightarrow v_2 \parallel \rho_2$. It is straightforward to verify that ρ is applicable to γ and results in δ . The cost of the obstacle moves of ρ is exactly $\text{cost}(\mu)$ in this case, and hence $\text{cost}(\rho) \leq \text{cost}(\pi)$. Next suppose that $\mu(u') = u$ for some $u' \in X(v_1)$. Note that $u_2 \neq u$ in this case, because $u_2 \in H_\delta$. Let ρ'_1 be obtained from ρ_1 by removing macro move $u' \rightarrow u$. If u' is not in the v_2 -side of v , then our plan ρ is

$$\rho'_1 \parallel v_1 \Rightarrow v \parallel v \Rightarrow u \parallel \rho_u \parallel u \Rightarrow v \parallel v \Rightarrow v_2 \parallel \rho_2 \parallel u' \rightarrow u,$$

with the cost condition satisfied similarly to the above. On the other hand, if u' is in the v_2 -side of v , our plan ρ is

$$\rho'_1 \parallel v_1 \Rightarrow v \parallel v \Rightarrow u \parallel \rho_u \parallel u' \rightarrow u_2 \parallel u \Rightarrow v \parallel v \Rightarrow v_2 \parallel \rho_2 \parallel u_2 \rightarrow u.$$

The cost of obstacle moves of ρ in this case is $\text{cost}(\mu) - \text{cost}(u' \rightarrow u) + \text{cost}(u' \rightarrow u_2) + \text{cost}(u_2 \rightarrow u) = \text{cost}(\mu) + 2\text{cost}(v, u_2)$. On the other hand, the cost of the robot moves in ρ is at least $2\text{cost}(v, u_2)$ less than that of π . Therefore $\text{cost}(\rho) \leq \text{cost}(\pi)$ in this case as well.

The case $u = u_2$ is similar (in fact it is symmetric to the above case with respect to the reversal of the motion.)

Now suppose $u \notin \{u_1, u_2\}$. We may assume without loss of generality that $u_1 = v_2$. To see this, suppose $u_1 \neq v_2$. Let π' be the suffix of π starting with the first occurrence of the robot move from u_1 to v . We may inductively apply the lemma and obtain ρ' equivalent to π' , in which the robot’s walk is $u_1 \Rightarrow v \Rightarrow u \Rightarrow v \Rightarrow v_2$. Therefore, if we replace π' by ρ' in π , the problem now reduces to the case where $u = u_2$, which has already been dealt with. Similarly, we may assume without loss of generality that $u_2 = v_1$.

Let i_u be an integer such that $\pi[i_u]$ is the robot move from v to u . Let π_u be the prefix of π consisting of i_u moves, and let γ_u be the result of applying π_u to γ . Clearly, u has a hole

in γ_u . Let μ_1 be an arbitrary minimum cost matching from γ to γ_u and μ_2 be an arbitrary minimum cost matching from γ_u to δ . Let $u' = u$ if $u \in H_\delta$ and $u' = \mu_1(u)$ otherwise. Suppose first that u' is not in the v_1 -side of v . Let γ' be the result of applying macro move $u \rightarrow u'$ to γ and let μ' be an arbitrary minimum cost matching from γ' to δ . Since $\text{cost}(\mu_1) - \text{cost}(u \rightarrow u') + \text{cost}(\mu_2) \geq \text{cost}(\mu')$, we have $\text{cost}(\mu') \leq \text{ocost}(\pi) - \text{cost}(u \rightarrow u')$. Applying Lemma 5 to γ' and δ , obtain a plan ρ' that sends γ' to δ with its robot walk being as required. We have $\text{ocost}(\rho') = \text{cost}(\mu') + 2 \text{cost}(v_1, v) \leq \text{ocost}(\pi) - \text{cost}(u \rightarrow u') + 2 \text{cost}(v_1, v)$. Our plan ρ is $u \rightarrow u' \parallel \rho'$, which is clearly applicable to γ and yields δ . Since $\text{ocost}(\rho) \leq \text{ocost}(\pi) + 2 \text{cost}(v_1, v)$ and $\text{rcost}(\rho) \leq \text{rcost}(\pi) - 2(\text{cost}(v_1, v) + \text{cost}(v_2, v))$, we have $\text{cost}(\rho) \leq \text{cost}(\pi)$. The case where u' is not in the v_2 -side of v is similar. This completes the proof since u' cannot be in the v_1 -side of v_2 and in the v_2 -side of v at the same time. \square

Proof of Lemma 6: Let π be an arbitrary optimal solution for the instance and let T be the robot trajectory of π . From the optimality of π , we may assume that t a leaf of T . Among the leaves of T that are not in the t -side of s , choose s' that is visited first by the robot in the application of π . Let P denote the path from s' to t . Note that s is on P , with the possibility that $s = s'$. For each internal vertex v of P , let T_v denote the subtree of T consisting of the vertices connected to v without going through other vertices on P . Suppose there is some internal vertex v of P such that $|V(T_v)| > 2$. Let $u \in V(T_v)$ be a vertex adjacent to v and let T' be the tree obtained from T by replacing removing all the vertices in $V(T_v) \setminus \{u, v\}$. We claim that there is a plan π' equivalent to π on γ without increased cost such that its robot trajectory is T' . This is shown by the application of Lemma 7 in the following manner. Let v_1 be the vertex adjacent to v in the s' -side of v and v_2 the vertex adjacent to v in the t -side of v . Let π_v denote the part of π that (1) starts with the first occurrence of the robot move $v_1 \Rightarrow v$ such that the next robot move is not $v \Rightarrow v_1$, and (2) ends with the last occurrence of the robot move $v \Rightarrow v_2$ such that the preceding robot move is not $v_2 \Rightarrow v$. Clearly, π_v contains an occurrence of the robot move $v \Rightarrow u$. Therefore, applying Lemma 7 to π_v and substituting the result for π_v in π , we obtain a plan π' whose robot trajectory is T' . Repeating this process, we eventually obtain a plan equivalent to π without increased cost, whose robot trajectory is an s' - t caterpillar C . If s is in the tail of C then we are done. Otherwise, we can choose a leaf s'' of C so that the maximal s'' - t caterpillar C' that is a subgraph of C contains s in its tail. By a process similar to the above, we may obtain a plan whose robot trajectory is C' . \square

We need one more lemma before proving the main result of this section.

Lemma 8 *Let π be a plan for tree G applicable to a configuration γ and let δ be the resulting configuration. Let $s = r_\gamma$ be the initial location of the robot and let $u \neq s$ be a vertex of G such that (1) $u \in H_\gamma$ and (2) the robot's walk in π does not visit any vertex in the u -side of s . Let v be a vertex not in the u -side of s such that $v \in O_\gamma$ and let γ' be a configuration defined by $r_{\gamma'} = r_\gamma$ and $O_{\gamma'} = (O_\gamma \setminus \{v\}) \cup \{u\}$. Then, there exists a plan π' with $\text{cost}(\pi') \leq \text{cost}(\pi) + \text{cost}(u \rightarrow v)$ that is applicable to γ' and results in δ .*

Proof: A simple transformation. \square

Theorem 9 *For any given problem instance (G, γ, t) , where G is a tree, there is an optimal solution that is quasi-bitonic.*

Proof: By Lemma 6, there is an optimal solution π whose robot trajectory is an s' - t caterpillar C that contains $s = r_\gamma$ in its tail. Let u_1, \dots, u_K be the list of leaves of C excluding s' and t , in the order of appearance along P . Let $u_0 = s'$ and $u_{K+1} = t$ for convenience. For each i , $1 \leq i \leq K$, let b_i denote the internal vertex on C that is adjacent to u_i . From the proof of Lemma 6, we may assume that the robot's walk in π is a concatenation of a walk from s to s' and a path-shaped walk from u_i to u_{i+1} for each i , $0 \leq i \leq K$. Moreover, by being careful in the application of Lemma 7 in the proof of Lemma 6, the path-shaped walk from u_i to u_{i+1} for each i , $1 \leq i \leq K$, may be assumed to consist of a move $u_i \Rightarrow b_i$ followed by a path-shaped walk from b_i to u_{i+1} , i.e., the move $u_i \Rightarrow b_i$ is not repeated. By Lemma 4, we may replace the path-shaped walk from s' to u_1 or from b_i to u_{i+1} for each $1 \leq i \leq K$ by a quasi-monotonic walk without increasing the cost of the plan. Moreover, from the proof of Lemma 4, we may assume that no wiggle or sidestep of the quasi-monotonic walk from b_i to u_{i+1} is at b_{i+1} . Therefore, the resulting robot's walk from s' to t is quasi-monotonic.

It remains to show that the robot's walk from s to s' is a path. We first assume that the length of π is the smallest possible, among the optimal solutions; otherwise, we simply appeal to the induction on the length of the plan. By Lemma 4, we may assume that the robot's walk from s to s' is quasi-monotonic. Suppose it contains a wiggle. Let v be the vertex closest to s' such that the walk from s to s' contains a wiggle at v . Let v_1 and v_2 be the vertices on the path from s to s' that are adjacent to v , with v_1 on the s -side of v . Let P' denote the path from v_1 to s' . Let π be represented as $\pi = \pi_1 \parallel \pi_2 \parallel \pi_3 \parallel \pi_4$, so that

- (1) the first move of π_2 is the first robot move of π from v_1 to v ,
- (2) the first move of π_3 is the second robot move of π from v_1 to v , and
- (3) the first move of π_4 is the last robot move of π from v to v_1 .

From the proof of Lemma 4, we may assume that π_2 is of the form $v_1 \Rightarrow v \parallel v \Rightarrow v_2 \parallel u \rightarrow x \parallel v_2 \Rightarrow v \parallel v \Rightarrow v_1 \parallel y \rightarrow u$, where u is a vertex next to v and not on P , x is a vertex in the v_1 -side of v , and y is the vertex adjacent to v_2 on P and in the opposite side to v . Let γ_1 denote the result of applying π_1 to γ , γ_2 the result of applying π_2 to γ_1 , and γ_3 the result of applying π_3 to γ_2 . Since the robot's walk from v_1 to s' in π_3 is a path by the assumption, we may assume, by the proof of Lemma 4, that each vertex of P' has a hole in γ_2 . Turning our attention to π_3 , we first note that macro move \mathcal{M}_{π_3} has at least one connected source-sink pair with the source in the v_1 -side of v and with the sink in the v_2 -side of v . To see this, suppose to the contrary macro move \mathcal{M}_{π_3} does not have such a source-sink pair. Then, \mathcal{M}_{π_3} can be decomposed into three macro moves M_1 , M_2 , and M_3 such that (1) all the sources and sinks of M_1 are in the v_1 -side of v , (2) all the sources and sinks of M_2 are in the v_2 -side of v , and (3) all the sources of M_3 are in the v_2 -side of v and all the sinks of M_3 are in the v_1 -side of v . Let γ'_3 be the result of applying plan $v_1 \Rightarrow v \parallel M_1 \parallel M_2$ to γ_2 . Applying Lemma 8 repeatedly to π_4 and γ_3 , we obtain a plan π'_4 applicable to γ'_3 with $\text{cost}(\pi'_4) \leq \text{cost}(\pi_4) + \text{cost}(M_3)$ such that $\pi' = \pi_1 \parallel \pi_2 \parallel \pi_3 \parallel \pi'_4$ is a solution to the given instance. Clearly, $\text{cost}(\pi') \leq \text{cost}(\pi)$ and the length of π' is strictly

smaller than the length of π , contradicting our assumption that π is the shortest optimal solution.

Therefore, as claimed, macro move \mathcal{M}_{π_3} has at least one connected source-sink pair (z, w) such that z is in the v_1 -side of v and w is in the v_2 -side of v . Clearly $z \neq v_1$ because $v_1 \in H_{\gamma_2}$. Moreover, from the proof of Lemma 4, we may choose such a pair (z, w) so that π_3 contains either (a) a macro move $z \rightarrow w$ or (b) two macro moves $z \rightarrow u$ and $u \rightarrow w$, where u is some sidestep vertex along P' . We may furthermore assume that w is not on P' . This is because, if no such pair (z, w) with w not on P' exists, then we can transform π_3 into a shorter equivalent plan by short-cutting the robot's visit to s' without increasing the cost; again a contradiction with the assumption of the shortest solution.

Now, let π_3'' be the plan obtained from π_3 by removing macro move $z \rightarrow w$ (case (a) above) or macro moves $z \rightarrow u$ and $u \rightarrow w$ (case b). It can be easily verified that plan $y \rightarrow w \parallel z \rightarrow x \parallel \pi_3''$ is applicable to γ_1 and results in γ_3 . Moreover, the cost of this plan is not greater than that of $\pi_2 \parallel \pi_3$. Therefore, π can be transformed into an equivalent shorter plan without increasing the cost, a contradiction to our assumption. \square