# Approximate Duality of Multicommodity Multiroute Flows and Cuts: Single Source Case

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#### Abstract

Given an integer h, a graph G = (V, E) with arbitrary positive edge capacities and k pairs of vertices  $(s_1, t_1), (s_2, t_2), \ldots, (s_k, t_k)$ , called terminals, an h-route cut is a set  $F \subseteq E$  of edges such that after the removal of the edges in F no pair  $s_i - t_i$  is connected by h edge-disjoint paths (i.e., the connectivity of every  $s_i - t_i$  pair is at most h - 1 in  $(V, E \setminus F)$ ). The h-route cut is a natural generalization of the classical cut problem for multicommodity flows (take h = 1). The main result of this paper is an  $O(h^52^{2h}(h + \log k)^2)$ -approximation algorithm for the minimum h-route cut problem in the case that  $s_1 = s_2 = \cdots = s_k$ , called the single source case. As a corollary of it we obtain an approximate duality theorem for multicoute multicommodity flows and cuts with a single source. This partially answers an open question posted in several previous papers dealing with cuts for multicommodity multiroute problems.

# 1 Introduction

The theory of networks and cuts and flows in networks is among the oldest areas of combinatorial optimization, dating back at least to the time of Gustav Kirchoff. Almost every student of computer science or mathematics has to come across Menger's theorem or the more general maximum flow – minimum cut theorem (Ford and Fulkerson [7], Elias, Feinstein and Shannon [6]): The maximum value of a flow from a source vertex to a sink vertex in a network equals the minimum capacity among all cuts between the source and the sink. Although this theorem perfectly describes the relation between classical flows and cuts in networks with a single commodity, there are many other (more general) reasonable settings where the theorem is not applicable. A natural generalization of the classical flows and cuts; although an exact duality does not hold for them, an approximate max-flow min-cut relationship does [8], cf. [12].

Another generalization of the classical flows and cuts are the *multiroute* flows and cuts [10], cf. [1]. A classical flow is a non-negative linear combination of unit flows along simple paths (after removing any cycles). An *h*-route flow is a non-negative linear combination of elementary *h*-route flows where an elementary *h*-route flow is a set of *h* edge-disjoint paths between a source and sink, each path carrying a unit of flow. An *h*-route cut is a set of edges whose removal decreases the maximum *h*-route flow to zero.

There are many papers dealing with the problem of multiroute flows (also known, e.g., as multi-path routing) and multiroute cuts. One reason for this interest are the possible applications of multiroute flows in communication networks (multiroute flows are more resilient against link failures and adversaries [2, 9, 13]). Also, it has been considered an important open problem whether the approximate duality of multicommodity flows and cuts does extend to *multiroute* multicommodity flows and cuts. There are several partial results in this respect. Bruhn et al. [4] proved an approximate duality theorem for single-source multicommodity *h*-route flows on uniform capacity networks that applies for any h > 1; the approximation factor is linear in *h* and does not depend on *k*. Chekuri and Khanna [5] described an approximate duality theorem for multicommodity 2-route cuts and flows on networks with arbitrary edge capacities. An analogous result was recently shown by Kolman and Scheideler [11] for 3-route multicommodity flows and cuts. The approximation factors in the last two results mentioned above are polylogarithmic in *k*. Another polylogarithmic approximation for the minimum multicommodity 2-route cut problem (without any explicit implications for the approximate duality) was given by Barman and Chawla [3]; they also provided several bicriteria approximations.

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On the lower bound side, the known  $\Omega(\log k)$  gap between the classical maximum multicommodity flow and the minimum cut carries over to the multiroute setting. Apart from this, a lower bound  $\Omega(h)$  for the same gap is known [3].

It is worth mentioning that in general there is no relationship between the sizes of a minimum h-route cut and a minimum (h-1)-route cut, apart from the obvious fact that the former is not larger than the latter. In particular, it may happen that the size of a minimum h-route cut is zero while the size of a minimum (h-1)-route cut is arbitrarily large.

1.1 New results. The main result of this paper is an  $O(h^5 2^{2h}(h + \log k)^2)$ -approximation algorithm for the minimum *h*-route cut problem with single source for any  $h \ge 1$ . As a corollary of it we obtain an approximate duality theorem for multicoute multicommodity flows and cuts for that case. This partially answers an open question posted in several previous papers dealing with cuts for multicommodity multiroute problems [5, 4, 3, 11]. Note that we focused on showing an approximation ratio that is polylogarithmic in k, at the cost of obtaining an exponential dependency on h. However, we suspect that a much lower dependency on h is possible.

1.2 Comparison with previous related results. At a high level, the structure of our approximation algorithm is the same as the structure of the approximation algorithm by Garg et al. [8] for classical multicommodity cuts (cf. [14, 3, 11]): while there exists a commodity whose terminals are still h-connected, perform an h-route cut separating the terminals of this commodity, charge the h-route cut to a certain part (volume) of the network (roughly, to the region that was used to define the cut) and proceed with the next iteration. The h-route cut in each iteration is derived from the fractional solution of the LP relaxation of the minimum h-route cut problem (see below) via the ball growing technique. The fractional solution of the LP relaxation is computed only once at the very beginning of the algorithm and the same solution (with some minor modifications due to local structural changes of the graph G during the algorithm) is used in all iterations.

Though the three above mentioned approximation algorithms [8, 3, 11] and our new algorithm share the same structure, including the usage of the ball growing technique, on the low level, our new algorithm substantially differs from all of the three older algorithms.

In the classical setting (i.e., for h = 1), after performing a cut around an appropriate ball with center in  $t_i$ , the vertices  $s_i$  and  $t_i$  belong to different components of connectivity. This way the problem is split by the cut into two independent subproblems.

For h = 2, after performing a 2-route cut for the commodity *i*, the vertices  $s_i$  and  $t_i$  will typically still belong to the same connected component but there always exists a cut consisting of a single edge *e* that separates  $s_i$  from  $t_i$ . Let *S* and *T* be the two components of the graph after removing *e*. We note that even without removing *e*, there is no simple path in *G* originating and terminating in *S* and going through *T* (and vice versa). Thus, similar to h = 1, the two parts *S* and *T* of the graph induce two independent subproblems (with respect to 2-route flows and cuts) even though *S* and *T* belong to the same connected component. It was this independence that made it possible to design the charging scheme for h = 2 [3].

For h = 3 the situation is different. After performing a 3-route cut for commodity i, we know that there exists a cut consisting of at most two edges whose removal disconnects  $s_i$  and  $t_i$ . Similarly to the previous case, let Sand T be the two parts of G obtained by removing the two edges. In contrast to  $h \leq 2$ , now there may exist paths originating in S and terminating in S that are going through T (and vice versa). Thus, the parts S and T do not induce independent subproblems any more. To cope with this problem, the approximation algorithm keeps track of the balls constructed in previous iterations. Fortunately, as S and T are connected by two edges only, the interactions between S and T are of a very specific form which makes it possible to cope with the minimum h-route cut problem for h = 3 [11]. The *multilevel* ball growing technique was introduced here as the main tool. On the technical level, after dealing recursively with all commodities with both terminals in T (say), it is possible to replace (the ball) T by a single edge (with endpoints being equal to the starting points of the two edges leading from S into T) which substantially simplifies the situation for later iterations.

For h > 3, the interactions between S and T (defined as above) are of much more complicated form and so are the interactions between the balls from previous iterations. One difficulty is that the balls cannot be substituted by single edges any more (not even by a tree, due to the many restrictive constraints: lengths of paths, sizes of cuts, etc.). A related difficulty is the following: occasionally, for an appropriate ball (i.e., an edge, after the substitution), the algorithm for h = 3 needs to decrease the connectivity between two *entry* nodes of the ball (i.e., between the nodes that connect the ball to the rest of the graph). As the maximum number of edge-disjoint paths in the ball between the two entry nodes of the ball is just one, decreasing the connectivity means performing an ordinary cut of the ball. After doing so, each of the two resulting components of the ball is connected to the rest of the graph by a single edge only, and thus, as explained earlier, the components correspond to independent subproblems and can be removed from the graph. However, for h > 3, after decreasing the connectivity between two subsets of entry nodes of a given ball, typically the ball will not split into two separated parts (think about a multiroute cut of the ball), and even if it does, both parts of the ball may contain two or more entry edges. Thus, we cannot remove them from the graph. However, this significantly complicates the charging mechanism.

The main technical contribution of this paper is an extension of the multilevel ball growing technique to the case of h > 3 with single source. Among various ideas is a technique to prevent edges within certain subgraphs (consisting of balls from previous iterations) to be cut or charged even though the original ball growing argument would demand that. To make the treatment of the balls possible, we maintain them in a laminar set system.

**1.3** Preliminaries. Suppose we are given a graph G = (V, E) with edge capacities  $c : E \to \mathbb{R}_+$  and commodities  $(s_1, t_1), \ldots, (s_k, t_k)$ . Let  $\mathcal{P}_i$  denote the set of all paths in G between  $s_i$  and  $t_i$ . In the single source version of the problem, the sources of all commodities are in the same vertex s, that is,  $s_i = s$  for each commodity i. Our approximation algorithm is based on the linear programming relaxation of the minimum h-route cut problem that was recently used to deal with the problem for h = 2 [3] and h = 3 [11]. For every edge e there is a variable  $x(e) \in \{0, 1\}$  indicating whether this edge belongs to the h-route cut, and for each commodity and each edge there is a variable  $x_i(e) \in \{0, 1\}$  serving as a proof that the edges with x(e) = 1 form really an h-route cut for the commodity i; the proof consists in showing that  $x + x_i$  corresponds to a classical cut with at most h - 1 edges with  $x_i(e) = 1$ . The minimum h-route cut problem can be stated as an integer linear program (ILP) as follows:

$$\min \sum_{e \in E} c(e)x(e)$$

$$\sum_{e \in P} (x(e) + x_i(e)) \geq 1 \quad \forall i \in [k], p \in \mathcal{P}_i$$

$$\sum_{e \in E} x_i(e) \leq h - 1 \quad \forall i \in [k]$$

$$x(e) \in \{0, 1\} \quad \forall e \in E$$

$$x_i(e) \in \{0, 1\} \quad \forall e \in E$$

In order to find a good approximate solution for this ILP, we work with the linear programming (LP) relaxation of it where the constraints  $x(e) \in \{0, 1\}$  and  $x_i(e) \in \{0, 1\}$  are replaced by  $x(e) \ge 0$  and by  $x_i(e) \ge 0$ , resp., for every edge e and every commodity i. We denote by  $\Phi$  the value of the objective function for the optimal solution of the LP relaxation.

Given a fractional solution x and  $x_i$ , shortest paths with respect to x or  $x + x_i$  naturally induce a metric on V; previous papers that exploit the ball growing technique are based on these metrics. In this paper we again work with metrics that are derived from the LP relaxation but we loosen the connection with the shortest paths. More precisely, throughout the algorithm and for each  $i \in [k]$ ,  $y_i(u)$  is the length of the shortest path in the input graph G, with respect to  $x + x_i$ , between  $t_i$  and the node  $u \in V$ . Important properties of the mappings  $y_i$  are that for each edge  $uv \in E$ ,  $|y_i(u) - y_i(v)| \le x(uv) + x_i(uv)$  and that  $y_i(s_i) \ge 1$  for all i.

We will need the following simple lemma (implicitly used in a simpler form by Garg et al. [8]).

LEMMA 1.1. (BALL GROWING LEMMA [11]) Let  $[l_1, r_1], [l_2, r_2], \ldots, [l_z, r_z]$  be internally disjoint intervals of real numbers such that  $l_1 < l_2 < \cdots < l_z$  and let  $\mathcal{R} = \bigcup_{i=1}^{z} [l_i, r_i]$ . Assume that the following holds:

- f is a nondecreasing function on  $\mathcal{R}$  and  $f(l_1) > 0$ ,
- f is differentiable on  $\mathcal{R}$ , except for finitely many points,
- g is a function on  $\mathcal{R}$  such that  $\forall r \in \mathcal{R}, g(r) \leq f'(r)$ , except for finitely many points.

Let  $\gamma = f(r_z)/f(l_1)$ . Then there exists  $r \in \mathcal{R}$  such that  $g(r) \leq \frac{1}{|\mathcal{R}|} \log \gamma \cdot f(r)$ . Also, there exists  $r \in \mathcal{R}$  such that  $g(r) \leq \frac{1}{|\mathcal{R}|} \cdot f(r_z)$ .

Kolman and Scheideler [11] proved that if I is an upper bound on the integrality gap of the linear program (1.1), F is the size of the maximum multicommodity h-route flow and C is the size of the minimum multicommodity h-route cut, then

$$\frac{F}{h} \le C \le I \cdot F \quad . \tag{1.2}$$

By describing, for the single source version of the problem, an  $O(h^5 2^{2h}(h+\log k)^2)$ -approximation algorithm based on the LP (1.1), we also show that the integrality gap of the LP for the single source case is  $O(h^5 2^{2h}(h+\log k)^2)$ which in turn implies the approximate duality theorem.

Without loss of generality we assume that  $h \leq k$  and  $k \geq 2$  (otherwise an  $O(h^2)$ -approximation is trivial [11]). For a graph H, we use E(H) to denote the edge set and V(H) to denote the node set of H. Similarly, for a set D of (sub)graphs, we define  $E(D) = \bigcup_{H \in D} E(H)$  and  $V(D) = \bigcup_{H \in D} V(D)$ . For a set F of edges we define  $c(F) = \sum_{e \in F} c(e)$ , and we say that  $\sum_{e \in F} x(e)c(e)$  is their volume. Note that the volume of the entire graph is a lower bound on the cost of an optimal solution.

## 2 Rounding Algorithm

In the single source version of the problem, the *sources* of all commodities are in the same vertex s, that is,  $s_i = s$  for each commodity i. As we already mentioned in the introduction, the algorithm works in iterations and in iteration i an h-route cut for commodity i is constructed (if it does not already exist). Similarly to the previous papers on multi-cut approximations, the h-route cut for commodity i is obtained by the ball growing technique; roughly, it consists of cutting all but h - 1 edges leaving a ball around  $t_i$  with a properly chosen radius r. We recall that the cuts constructed by the multicut algorithm for classical multicommodity flows [8] are of the form

$$\delta(r) = \{ uv \in E \mid y_i(u) \le r < y_i(v) \} .$$

In iteration *i*, we view every edge  $uv \in E$  as a segment of length  $|y_i(u) - y_i(v)|$  consisting of two parts: an  $x_i$ -part of length (at most)  $x_i(uv)$  followed by an *x*-part of length (at most) x(uv) on the way from  $t_i$ . (Note that the ordering of *x* and  $x_i$  is different from our previous paper [11] since this particular ordering is more convenient for our analysis here.) We define

$$\delta_x(r) = \{ uv \in E \mid y_i(u) + x_i(uv) \le r < y_i(v) \}$$

Note that for every  $r \in (0, 1)$ , if  $|\delta(r) \setminus \delta_x(r)| \leq h-1$ , then  $\delta_x(r)$  is an *h*-route cut between  $t_i$  and *s*. Our intention is, roughly, for each commodity *i* to find a radius *r* such that  $\delta_x(r)$  is a cheap *h*-route cut between  $s_i$  and  $t_i$ . In the rest of this section we describe in detail a single iteration of our algorithm. We start by introducing a necessary notation and several ingredients that are important for the algorithm.

**2.1** Levels. In our algorithm, edges may be charged several times for different *h*-route cuts. Therefore we maintain for every edge *e* a counter  $\ell(e)$  called the *level* of the edge, satisfying at the end of every iteration that  $\ell(e)$  is an upper bound on the number of times the edge *e* was charged for a cut (i.e., for a removal of some edges). Initially,  $\ell(e) = 0$  for every edge  $e \in E$ . We will organize the cutting and charging in such a way that the level of every edge is upper bounded by  $2h + \log k$  (see Lemma 2.1 below). The use of levels was the main innovation of our multilevel ball growing technique [11] but here it is much more tricky to apply.

**2.2** Restricted structures. In order to keep the edge levels small when constructing a new *h*-route cut, we try to avoid charging the cost of the new cut to edges of high level. For this we organize the edges with positive level into restricted structures which are subgraphs of *G*. Every edge with positive level belongs to a restricted structure from *H*. Roughly speaking, the restricted structures in iteration *i* will coincide with balls constructed by the algorithm around the terminals  $t_1, \ldots, t_{i-1}$  in previous iterations. We maintain the restricted structures in a set *D* satisfying a *laminar property*: for any two subgraphs  $H_1, H_2 \in D, H_1 \subset H_2$ , or  $H_2 \subset H_1$ , or  $H_1 \cap H_2 = \emptyset$ . Initially,  $D = \emptyset$ . For any  $H \in D$  we denote by D(H) the restricted structures from *D* that are subgraphs of *H*, that is,  $D(H) = \{H' \in D \mid H' \subsetneq H\}$ , and we denote by  $E_p(H)$  the set of edges from *H* that do not belong to any  $H' \in D(H)$ , that is,  $E_p(H) = E(H) \setminus \bigcup_{H' \in D(H)} E(H')$ ; the edges in  $E_p(H)$  are called the *proper edges of H*. The set of all edges that connect  $H \in D$  to the rest of *G* are called its *entry edges* and are denoted by  $in_E(H)$ .

and the set of endpoints of the entry edges that are inside of H are called *entry nodes* and denoted by  $in_V(H)$ . We define the *level of*  $H \in D$  as

$$\ell(H) = \max\{\ell(e) \mid e \in E_p(H)\}.$$

By saying that we assign a level of  $\ell$  to a restricted structure H, we mean setting  $\ell(e) = \ell$  for every proper edge  $e \in E_p(H)$  of H.

A related notion of *restricted edge* appeared in our paper about 3-route cuts [11]. In that setting it was possible to keep the restricted structures edge disjoint and to reduce them to individual edges which significantly simplified their treatment.

To control the interactions between the restricted structures, we associate with every  $H \in D$  a credit

$$\phi(H) = 2^{2|in_E(H)| + \ell(H)} , \qquad (2.3)$$

and we maintain the following invariant.

INVARIANT 2.1. At the end of iteration i the restricted structures in D satisfy the laminar property and for every  $H \in D$ ,

$$2 \le |in_E(H)| \le h - 1 , and \tag{2.4}$$

$$\ell(H) < \ell(H') \quad for \ all \ H' \in D(H) \ , \ and \tag{2.5}$$

$$\sum_{H \in D} \phi(H) \le i \cdot 2^{2h} . \tag{2.6}$$

The properties (2.4) and (2.5) are easy to maintain: If there is  $H \in D$  with  $|in_E(H)| \leq 1$ , we remove H from D and we also remove it temporarily from G until the last commodity gets disconnected; as no simple path can enter H and leave it again, by putting H back in G we will not damage the multiroute cut computed by the algorithm. If  $\ell(H) \geq \ell(H')$  for some  $H' \in D(H)$ , then we remove H' from D and raise the level of its edges to  $\ell(H)$  without affecting  $\phi(H)$ .

We also note that if  $E_p(H) = \emptyset$  for some  $H \in D$ , then H can be removed from D as all of its edges are already covered by other restricted structures and the level of these structures is guaranteed by Invariant 2.1 to be larger than  $\ell(H)$ .

Under the assumption that Invariant 2.1 holds, we observe a simple fact.

LEMMA 2.1. For every edge e it holds that  $\ell(e) \leq 2h + \log i$  at the end of iteration i.

*Proof.* The bound is implied by the definition (2.3) and constraints (2.4) and (2.6) in Invariant 2.1 which require that  $2^{2 \cdot 2 + \ell(e)} \leq i \cdot 2^{2h}$  for any edge e.

In the rest of this section we explain iteration i of our algorithm step by step.

**2.3** Partitioning of D. Earlier in this section we outlined our plan to avoid cutting and charging edges of high level. This was an (unrealistic) oversimplification. Instead, roughly speaking, we will allow cutting and charging edges in restricted structures of level  $\ell$  if we ensure that we cut or charge at least *two* restricted structures of level  $\ell$ . By doing so we obtain a tree of restricted structures with logarithmic depth. This is the motivation for partitioning the set D into two parts as described below; the set  $D_1$  is prohibited for cuts and charges while the set  $D_2$  is allowed for cuts and charges. The exact partitioning procedure is not based on the number of restricted structures of certain level but, instead, on the sum of potentials of restricted structures of this level.

At the beginning of iteration i we partition the set D of restricted structures into two parts,  $D_1$  and  $D_2$ . For each level  $\ell$  we check whether  $\sum_{H \in D:\ell(H)=\ell} \phi(H) \geq 2h^2 2^{2h+\ell}$ . If so, we put to  $D_1$  the minimum number of restricted structures of level  $\ell$  whose credit sums up to at least  $2h^2 2^{2h+\ell}$ , starting with the closest to  $t_i$ (w.r.t.  $\min_{v \in V(H)} y_i(v)$ ). If not, we put to  $D_1$  all restricted structures of level  $\ell$ . This is done for every level. After processing all levels, we put all remaining restricted structures to  $D_2$ , that is, we set  $D_2 = D \setminus D_1$ . Based on the restriction on  $D_1$  we get: LEMMA 2.2. For each level  $\ell$ ,  $\sum_{H \in D_1: \ell(H) = \ell} |in_E(H)| \le h^2 2^{2h-1}$ .

Proof. From the definition of the credit it follows that  $\sum_{H \in D_1:\ell(H)=\ell} \phi(H) \leq (2h^2 + 1)2^{2h+\ell}$  and thus  $\sum_{H \in D_1:\ell(H)=\ell} 2^{2|in_E(H)|} \leq (2h^2 + 1)2^{2h}$ . It is easy to check that the maximum value of  $\sum_{H \in D_1:\ell(H)=\ell} |in_E(H)|$  is reached when  $|in_E(H)| = 2$  for every H, which results in an upper bound of  $2 \cdot (2h^2 + 1)2^{2h}/2^{2\cdot 2} \leq h^2 2^{2h-1}$  for  $\sum_{H \in D_1:\ell(H)=\ell} |in_E(H)|$ .

The bound from this lemma will be crucial later in the proof of Lemma 2.4.

**2.4** Preprocessing of  $D_1$  and G. Assume that we are in iteration i and H is a restricted structure from  $D_1$ . Let  $R_H = [\min_{u \in in_V(H)} y_i(u), \max_{u \in in_V(H)} y_i(u))$  be a subinterval of [0, 1). For any subgraph H' of H with the same vertex set and for  $r \in R_H$  we define mincut<sub>H'</sub>(r) as follows:

- If the cardinality of the classical single-commodity cut of minimum cardinality (i.e., all edges have cost 1 when evaluating the cost of cuts) in H' between  $S(r) = \{v \in in_V(H) \mid y_i(v) \leq r\}$  and  $T(r) = in_V(H) \setminus S(r)$  is at most h 1, then mincut<sub>H'</sub>(r) is the edge set of this cut.
- Otherwise mincut<sub>H'</sub>(r) is defined as the set of the entry edges of H' that are adjacent to T(r).

For notational simplicity, for  $r \notin R_H$  we define  $\operatorname{mincut}_{H'}(r) = \emptyset$ . Note that for every r, the cardinality of  $\operatorname{mincut}_{H'}(r)$  is at most h-1.

The following lemma says that for every  $H \in D_1$ , by removing a few edges from E(H) (the set  $F_H$ ) that we can pay for by the volume  $\sum_{e \in E(H)} x(e)c(e)$  of H, and by excluding a short subinterval from  $R_H$  (the interval  $I_H$ ) we ensure that on average the mincuts of  $H \setminus F_H$  are "small" (as the sum of  $x_i$ s is small). This will allow us to avoid cutting edges in restricted subgraphs in  $D_1$  by multiroute cuts, even though the standard ball growing technique would demand that.

LEMMA 2.3. For every  $H \in D_1$  and every integer p there is a subset  $F_H \subseteq E(H)$  and a subset  $I_H \subseteq R_H$  so that for  $H' = H \setminus F_H$ ,

$$\int_{r \in R_H \setminus I_H} |\operatorname{mincut}_{H'}(r)| \, dr \le \sum_{e \in E(H)} x_i(e) \,, \tag{2.7}$$

$$\sum_{e \in F_H} c(e) = O(h^2 p) \sum_{e \in E(H)} x(e)c(e) , \qquad (2.8)$$

$$|I_H| \le |in_V(H)|/p$$
 . (2.9)

Moreover, the sets  $I_H$  and  $F_H$  can be computed in polynomial time.

Proof. For  $h' = |in_V(H)|$ , let  $u_1, \ldots, u_{h'}$  be the entry nodes of H in increasing order of  $r_j = y_i(u_j)$  and let  $I_j = [r_j, r_{j+1})$ . We proceed through the intervals  $I_j$  one by one, starting with  $I_1$ , and for each of them we update the sets  $I_H$  and  $F_H$ . Initially, we set  $I_H = \emptyset$  and  $F_H = \emptyset$ . We use H' as a shortcut for  $H \setminus F_H$  and  $\delta_x^{H'}(r)$  as a shortcut for  $\delta_x(r) \cap E(H')$ .

Assume that we are dealing with the interval  $I_j$ . Let  $l = |\min(t_{H'}(r_j))|$ , and for any  $l' \leq l$  let  $\mathcal{F}_j^{l'}$  be the set of all tuples of l' edge-disjoint paths in H between the node sets  $S(r_j)$  and  $T(r_j)$ . For each  $B \in \mathcal{F}_j^{l'}$  we define  $I_B = \{r \in I_j \mid \delta_x^{H'}(r) \cap B \neq \emptyset\}$ , that is,  $I_B$  is the set of radii for which  $\delta(r)$  hits some edge from  $B \cap E(H')$  in its x-part. We distinguish between two cases.

1. If  $\min_{B \in \mathcal{F}_j^l} |I_B| \leq 1/p$ , we extend  $I_H$  by  $I_{B'}$  where B' is a tuple from  $\mathcal{F}_j^l$  for which the minimum is achieved. Clearly,

$$|I_{B'}| \le 1/p$$
 . (2.10)

This fact will be used to guarantee the property (2.9). Also notice that

$$\int_{r \in I_j \setminus I_{B'}} \delta_{x_i}^{H'}(r) dr \geq \int_{r \in I_j \setminus I_{B'}} l dr$$

$$= \int_{r \in I_j \setminus I_{B'}} |\operatorname{mincut}_{H'}(r)| dr \qquad (2.11)$$

so property (2.7) holds for the subinterval  $I_j \setminus I_H$ .

2. If  $\min_{B \in \mathcal{F}_j^l} |I_B| > 1/p$ , we let l' be the minimum index for which  $\min_{B \in \mathcal{F}_j^{l'}} |I_B| > 1/p$ . Then the vector x scaled by hp represents a feasible fractional solution of a linear programming relaxation, analogous to the linear program (1.1), of an l'-route cut between  $S(r_j)$  and  $T(r_j)$  in H' (see the proof of Theorem 14 in the paper [11] for a detailed description how to obtain the actual fractional solution). By rounding this fractional solution of a single commodity multiroute cut by the ball growing technique, exploiting the last statement of the Ball Growing Lemma, we obtain in polynomial time an integral l'-route cut  $F_j$  between  $S(r_j)$  and  $T(r_j)$  of size

$$\sum_{e \in F_j} c(e) = O(h^2 p) \int_{r \in I_j} c(\delta_x^H(r)) \, dr \,.$$
(2.12)

We add the edges from  $F_j$  to  $F_H$  and adjust H' accordingly. Since now  $|\operatorname{mincut}_{H'}(r_j)| \leq l' - 1$  and since, by the assumption of this case,  $\min_{B \in \mathcal{F}_j^{l'-1}} |I_B| \leq 1/p$ , we can continue as in the case 1 to complete our dealing with the interval  $I_j$ .

Combining the inequalities (2.10), (2.11) and (2.12) over all intervals  $I_i$  yields the lemma.

Lemma 2.3 ignores the fact that we may have restricted structures inside of H. As we have a laminar family of restricted structures, we have to be a bit more careful in choosing  $F_H$  so that the charging in the algorithm only affects structures that are actually cut. Consider any  $H \in D_1$ . Instead of just focusing on the entry nodes of H, we consider all entry nodes in  $in_V(H) = in_V(H) \cup \bigcup_{H' \in \bar{D}_1(H)} in_V(H')$  (where  $\bar{D}_1(H)$  denotes the set of maximal  $D_1$ -structures contained in H, that is, the set of those that are not contained in any other  $D_1$ -structure in H). We order the nodes in  $in_V(H)$  according to increasing  $y_i$ -distance from  $t_i$ , call the resulting distances  $r_1, \ldots, r_{|in_V(H)|}$ , and then apply the proof of Lemma 2.3 to them. Taking over the notation in that proof and renaming  $F_j$  to  $\bar{F}_j$ ,  $F_H$  to  $\bar{F}_H$ ,  $I_H$  to  $\bar{I}_H$  and  $I_j$  to  $\bar{I}_j$  to avoid confusion with the parameters in Lemma 2.3, this results in the following property.

COROLLARY 2.1. For every  $H \in D_1$  and every integer p there is a subset  $\bar{F}_H = \bigcup_{j=1}^{|\bar{i}n_V(H)|-1} \bar{F}_j \subseteq E(H)$  and a subset  $\bar{I}_H = \bigcup_{j=1}^{|\bar{i}n_V(H)|-1} \bar{I}_j \subseteq R_H$  so that for  $H' = (V(H), E(H) \setminus (E(D_1(H)) \cup \bar{F}_H))$ ,

$$\int_{r \in R_H \setminus \bar{I}_H} |\operatorname{mincut}_{H'}(r)| \, dr \le \sum_{e \in E'(H)} x_i(e) \,, \tag{2.13}$$

$$\sum_{e \in \bar{F}_j} c(e) = O(h^2 p) \int_{r \in \bar{I}_j} c(\delta_x^{H'}(r)) \, dr \,\,, \tag{2.14}$$

$$|\bar{I}_H| \le |\bar{i}n_V(H)|/p$$
 . (2.15)

Moreover, all of the involved sets can be computed in polynomial time.

It will be important in the proof of Lemma 2.4 that for a proper choice of the parameter p, the Corollary implies an upper bound on  $\sum_{H \in D_1} \bar{I}_H$ . In particular, by plugging in  $2h \sum_{H \in D_1} |\bar{i}n_V(H)|$  for p, we obtain

$$\sum_{H \in D_1} |\bar{I}_H| \le 1/(2h) \quad . \tag{2.16}$$

In our analysis we will also use the fact that

$$p = O(h^3 2^{2h} (h + \log k)) \quad , \tag{2.17}$$

by the choice of p and by Lemma 2.1 and Lemma 2.2.

Also note that by the choice of the strips  $\bar{I}_j$  in Corollary 2.1 it holds for each strip  $\bar{I}_j$  that a structure  $H' \in D(H)$  either has nodes on both sides of the strip or none of the edges in E(H') will be cut by  $\bar{F}_j$  (which also means it does not have to be charged for that cut).

In the preprocessing phase, we temporarily remove from G and from every  $H \in D_1$  the subset of edges  $\overline{F}_H$  as given by Corollary 2.1, in order to be able to apply the ball growing technique. In particular, we define  $\overline{F}_i = \bigcup_{H \in D_1} \overline{F}_H$  and  $I = \bigcup_{H \in D_1} \overline{I}_H$  and  $\overline{G}_i = G_i \setminus \overline{F}_i$  where  $G_i$  denotes the graph G at the beginning of iteration i. Later, for most  $H \in D_1$ , we will put the set  $\overline{F}_H$  back into  $\overline{G}_i$ ; the details are provided later in this section. The cost of those edges from  $\overline{F}_i$  that are removed permanently, is charged to the volume of the edges that contribute to the integral on the right-hand side of the equation (2.14); we will ensure that the level of these edges increases by one at least. However, we stress that we do not increase the level of any edge at this point.

**2.5** *h*-route cut. The crucial idea for the 3-route cut algorithm [11] was to consider only radii that do not cut edges of structures in  $D_1$  in their *x*-parts; as  $D_1$  was just an edge set in that case, it was relatively easy to show that this restriction does not reduce the set of possible radii too much. Here, Corollary 2.1 will help us to mimic the same approach. We are looking for *h*-route cuts in  $\overline{G}_i$  of the following form:

$$\delta_h(r) = \delta_x(r) \setminus E(D_1) .$$

We also define

$$\overline{\delta}_h(r) = (\delta_{x_i}(r) \setminus E(D_1)) \cup \bigcup_{H \in D_1} \operatorname{mincut}_H(r) .$$

Note that  $\delta_h(r)$  need not be an *h*-route cut between *s* and  $t_i$ , and that  $\delta_h(r) \cup \overline{\delta}_h(r)$  is a classical cut between *s* and  $t_i$ . Thus, if  $|\overline{\delta}_h(r)| \leq h - 1$  then  $\delta_h(r)$  is an *h*-route cut. Let  $\mathcal{R}$  be the set

 $\mathcal{R} = \{ r \in [0,1] \setminus I \mid \delta_h(r) \text{ is an } h \text{-route cut} \} .$ 

We say that  $\mathcal{R}$  is the set of *good radii* for  $\overline{G}_i$ . Below we prove that the measure of the set  $\mathcal{R}$  is large which will make it possible to apply the Ball Growing Lemma (Lemma 1.1), and thus, to find a cheap *h*-route cut between  $t_i$  and s.

LEMMA 2.4. (GOOD RADII)

$$|\mathcal{R}| \ge 1/(2h) \ . \tag{2.18}$$

*Proof.* We first prove that

$$\int_{r\in[0,1]\backslash I} |\bar{\delta}_h(r)| \ dr \le h-1 \ .$$

Think about the edges that contribute to the value of the integral. They can be divided into two subsets: edges from  $E(D_1)$ , and edges from  $E \setminus E(D_1)$ . By inequality (2.13) from Corollary 2.1, the contribution of the first group is at most  $\sum_{e \in E(D_1)} x_i(e)$ ; the contribution of the other group is at most  $\sum_{e \in E(D_1)} x_i(e)$ . Since the vectors x and  $x_i$  constitute a fractional solution of the linear program (1.1), the sum of these two upper bounds is at most h - 1.

Once we have the above bound, we easily conclude that the measure of the set  $X = \{r \in [0,1] \setminus I \mid |\bar{\delta}_h(r)| > h-1\}$  is at most 1-1/h; just note that  $h|X| = \int_{r \in X} h \, dr \leq \int_{r \in [0,1] \setminus I} |\bar{\delta}_h(r)| \leq h-1$ .

We already observed in inequality (2.16) that  $I = \sum_{H \in D_1} \overline{I}_H \leq 1/(2h)$ . Since  $[0,1] \setminus (X \cup I) \subseteq \mathcal{R}$ , the claim of the lemma follows.

We are almost ready to apply the Ball Growing Lemma. We define the volume function

$$Vol(r) = \frac{\Phi}{k} + \int_{\rho \in \mathcal{R} \cap [0,r]} c(\delta_h(\rho)) \ d\rho ,$$

where  $\Phi = \sum_{e \in E} c(e)x(e)$ . Notice that for k source-destination pairs the  $\Phi/k$ -part in the volume just adds up to  $\Phi$ , so the critical part of the volume is its other part. Since the functions f(r) := Vol(r) and  $g(r) := c(\delta_h(r)) = \sum_{e \in \delta_h(r)} c(e)$  satisfy the assumptions of the Ball Growing Lemma on the set of good radii  $\mathcal{R}$ , we obtain the following lemma (cf. [11]). LEMMA 2.5. (CHEAP *h*-ROUTE CUT) There exists  $r \in \mathcal{R}$  such that  $c(\delta_h(r)) \leq 2h \log(2k) \cdot Vol(r)$ . Moreover, such a radius can be computed in polynomial time.

As the *h*-route cut between *s* and  $t_i$  in  $\bar{G}_i$  we use the set  $F_i = \delta_h(r)$  where *r* is the radius from the lemma. Note that according to the definition of  $\delta_h(r)$  no edges in  $\bar{\delta}_h(r) \cup E(D_1)$  contribute towards the volume Vol(r) (the edges in  $\bar{\delta}_h(r) \setminus E(D_1)$  are cut in their  $x_i$  part, and by our assumption on the ordering of the *x*- and  $x_i$ -parts, the  $x_i$ -parts precede the *x*-parts on the way from  $t_i$ ). We say that an edge *e* is charged for the cut  $F_i$ , if *e* contributes to Vol(r), and a restricted structure *H* is charged for  $F_i$ , if some edge from E(H) is charged for  $F_i$ . We remove  $F_i$  from  $\bar{G}_i$  (which may only remove edges in  $D_2$ -structures that are not contained in any  $D_1$ -structure) and proceed with updating *D* so that Invariant 2.1 is preserved.

**2.6** Update of the set D. In the following let  $B(r) = \{u \in V \mid y_i(u) \leq r\}$  and let H(r) be the subgraph of  $\overline{G}_i$  induced by the node set B(r) where r is the radius from Lemma 2.5. We define the entry edges of H(r) as  $in_E(H(r)) = \overline{\delta}_h(r)$ . Our intention is to increase the level of every edge in  $E(H(r)) \setminus E(D_1)$  by one and to add H(r) to D. However, when doing this, we may no longer have a laminar family of restricted structures. Apart from this, to satisfy inequality (2.6) in Invariant 2.1), we also have to make sure that the sum of credits over all restricted structures does not increase by more than  $2^{2h}$ . We handle these issues in three stages: first, we update the level and the credit of restricted structures, and, finally, we update the level and the credit of the remaining restricted structures that were affected in iteration i. Before tackling the details, we consider two easy cases that allow much simpler treatment.

If there are no restricted structures that intersect with H(r), we only set the level of every edge in H(r) to 1, add H(r) to D and undo the cutting of all edges in  $\overline{F}_i$ . As  $|in_E(H(r))| \leq h-1$  and as the total credit can increase by  $2^{2h}$  in each iteration, we can afford to do that (cf. property (2.6) in Invariant 2.1 and the definition (2.3) of the credit of  $H \in D$ ). The laminar property of D is obviously preserved.

A slightly more difficult situation is the case that every restricted structure  $H \in D$  is either completely inside or completely outside of H(r). In this case, we still have a laminar family of restricted structures. Again, we can undo the cutting of all edges in  $\overline{F}_i$  without any harm for the multiroute cut. Thus, there is no need to increase the level of any edge in a  $D_1$ -structure and we only care about the charging for the edges from  $F_i$ . Any  $D_2$ -structure that is outside of H(r) does not contribute to the volume Vol(r) and can therefore maintain its current level. If there is no  $D_2$ -structure inside H(r), we are done. Otherwise let H be the  $D_2$ -structure of maximum level that is inside H(r). Then we know from the definition of  $D_1$  that  $\sum_{H' \in D_1: \ell(H') = \ell(H)} \phi(H') \ge 2h^2 2^{2h+\ell(H)}$  and these  $D_1$ -structures must all be inside of H(r). Hence, when removing from D all restricted structures in H(r) that have a level of at most  $\ell(H)$ , we obtain enough credit to assign a level of  $\ell + 1$  to every proper edge of H(r), and to pay in this way for the cut  $F_i$  without violating Invariant 2.1.

**2.6.1** Pre-updating the credit and the levels. The general case needs much more careful arguments. The main objective of this paragraph is to show how to obtain enough credit for the necessary increase of levels, in the situation that there is a  $D_2$ -structure H that intersects with H(r). The main difficulty is that the  $D_1$ -structures of level  $\ell(H)$  whose credit we would like to use, may not be fully included in H(r).

In the following lines we consider a maximal (with respect to inclusion) restricted structure  $H \in D$  with  $V(H) \cap V(H(r)) \neq \emptyset$  and  $V(H) \not\subseteq V(H(r))$  (i.e., H intersects with H(r) but is not fully contained in it), such that H is cut by H(r) into two disconnected subgraphs  $H_1$  and  $H_2$  (i.e., there is no edge connecting  $H_1$  and  $H_2$  in  $\overline{G}_i \setminus F_i$ ), where  $H_1$  is inside of H(r) and  $H_2$  is outside (if there is no such H, the algorithm skips the following steps). We distinguish the following cases:

1. Both  $H_1$  and  $H_2$  have at least two entry edges. Then it follows from  $|in_E(H_1)| + |in_E(H_2)| \le |in_E(H)|$  that  $|in_E(H_1)| \le |in_E(H)| - 2$  and  $|in_E(H_1)| \le |in_E(H)| - 2$ , which implies that

$$2^{2|in_{E}(H_{1})|+(\ell+1)} + 2^{2|in_{E}(H_{2})|+(\ell+1)} \leq (2^{2(|in_{E}(H)|-2)} + 2^{2(|in_{E}(H)|-2)})2^{\ell+1}$$

$$< 2^{2|in_E(H)|-2+(\ell+1)} = \phi(H)/2$$

Thus, we can set the level of every proper edge of  $H_1$  and  $H_2$  to  $\ell+1$  and this way to pay for the corresponding part of the cut  $F_i \cup \overline{F_i}$ . In fact, half of the credit of H still remains which we will make use of below.

- 2.  $H_1$  (resp.  $H_2$ ) has exactly one entry edge. Then we can temporarily remove  $H_1$  (resp.  $H_2$ ) from D and from G as it is not relevant any more for future h-route cuts and we can raise the level of the remaining  $H_2$  (resp.  $H_1$ ) by 1 with the credit of H. In fact, also here half of the credit of H still remains, which we will make use of below.
- 3.  $H_1$  does not contain any entry edge. Then we can temporarily remove  $H_1$  from D and from G as well as it is isolated. If H is a  $D_1$ -structure, we undo all mincuts in  $H_2$ . If H is a  $D_2$ -structure, no edge from  $H_2$ contributes to Vol(r) because it is outside of H(r). Hence, in both cases we can leave the level of every edge in  $H_2$  at its original level.
- 4.  $H_2$  does not contain any entry edge. Then we undo any cutting from  $F_i \cup \overline{F_i}$  inside of H and extend H(r) by H. If H is a  $D_1$ -structure, then no edge from H contributes to Vol(r) so we do not have to raise its level. If H is a  $D_2$ -structure, we deal with it below.

If  $D(H) \neq \emptyset$  and cases 1-3 were applied to H, we deal with any  $H' \in D(H)$  that is cut by H(r) into two disconnected subgraphs in the order of increasing level in the same way as we dealt with H, i.e., we apply the cases above to it. If a part of a structure got thrown away due to case 2 or 3 of some previously considered structure, we treat it as having no entry edge in that part. In this way, all of these structures receive a proper credit update reflecting their current level (except for those  $D_2$ -structures satisfying case 4). Also, we repaired the laminar property for these structures. Note that when using the cases above, we never shrink H(r) but possibly extend it (when case 4 is applied). This will be important when dealing with the  $D_2$ -structures that are (partly) charged for the cut  $F_i$ , which we are considering next.

Suppose that there is a  $D_2$ -structure H that is (partly) charged for the cut  $F_i$ . Let  $\ell = \ell(H)$  and let  $D(\ell)$  (resp.  $D_1(\ell)$ ) be the set of all  $H' \in D$  (resp.  $H' \in D_1$ ) of level  $\ell$  with  $V(H') \cap B(r) \neq \emptyset$ . We know from our rule of partitioning D that  $\sum_{H \in D_1(\ell)} \phi(H) \geq 2h^2 2^{2h+\ell}$ . Now, every structure  $H' \in D_1(\ell)$  satisfies one of the following properties:

- (a) H' is inside of H(r),
- (b) H' is inside of some maximal structure  $H'' \in \overline{D}$  that is not cut by H(r) into disconnected subgraphs,
- (c) H' is inside of some maximal structure  $H'' \in \overline{D}$  that is cut into disconnected subgraphs by H(r).

In the first two cases, we remove H' from D and thereby free up all of its credit, and in case (c) we make use of the property that at least one entry node of H' must be inside of H(r) (as the  $D_2$ -structure H is charged for  $F_i$ , at least one of its entry node must be closer to  $t_i$  than r which in turn implies that at least one entry node of H'is at distance at most r from  $t_i$ ). Hence, in case (c) we can make use of the fact that either case 1 or 2 above applied to H', so at least half of its credit can be taken away from it. Thus, we can free up a total credit of at least

$$(1/2)\sum_{H\in D_1(\ell)}\phi(H) \ge h^2 \cdot 2^{2h+\ell}$$

As there are at most h - 1 maximal restricted subgraphs  $H' \in D(\ell)$  that intersect with H(r) but are not fully contained in it and yet are not disconnected in  $\overline{G}_i \setminus F_i$ , there is enough credit to increase the level of H(r) as well as of all these structures to  $\ell + 1$ . This justifies the removal of all  $H' \in D_1(\ell)$  that satisfy property (a) or (b) above because now they are contained in a restricted structure with a larger level then themselves. Also, note that we can remove all  $D_1$ - and  $D_2$ -structures of level at most  $\ell$  that are inside of H(r) (such as those to which we applied case 4 above) for the same reason which resolves the case 4.

At the end of this phase, we have dealt with updating the levels of all  $D_2$ -structures intersecting with H(r), and all  $D_1$ -structures that are inside of H have also been dealt with (by either undoing any cutting in them or by removing them from D). Thus, it remains to consider the  $D_1$ -structures that intersect with H(r) but are not fully contained in it. Also, we still need to repair the laminar property of D (which we have only done so far for maximal structures that are cut into two disconnected subgraphs by H(r) and their substructures). **2.6.2** Restoration of the laminar property of D. Let  $D' = \{H \in D \mid V(H) \cap B(r) \neq \emptyset$  and  $V(H) \not\subseteq B(r)\}$ . In order to avoid the intersection of H(r) with the restricted structures from D', we process the restricted structures in D' in the order of their (original) level, starting with restricted structures of the lowest level, and for each such problematic  $H \in D'$  we perform either a local change of H or a local change of H(r). For notational simplicity, for a restricted structure H we define  $\overline{E}(H) = E(H) \cup in_E(H)$ , and similarly  $\overline{E}(H(r)) = E(H(r)) \cup in_E(H(r))$ . For each restricted structure H from D' we define three sets (see Figure 1):  $A_H = in_E(H) \setminus \overline{E}(H(r))$ ,  $B_H = in_E(H(r)) \cap \overline{E}(H)$ ,  $C_H = in_E(H) \cap \overline{E}(H(r))$ . Based on the quantities of  $A_H, B_H$  and  $C_H$ , we distinguish between three types of intersections of H with H(r).



Figure 1: How to deal with different types of intersection of H(r) and  $H \in D'$ .

- 1.  $|B_H| < |A_H|$  and  $|B_H| < |C_H|$ : In this case, H is replaced in D by its two subgraphs:  $H_1 = H \cap H(r)$ with  $in_E(H_1) = C_H \cup B_H$  and  $H_2 = H \setminus H_1$  with  $in_E(H_2) = B_H \cup A_H$ . Also, the edges belonging to mincut\_H(r) in  $\overline{F}_H$  are left removed and all other edges in  $\overline{F}_H$  are given back to  $\overline{G}_i$ , i.e.,  $\overline{F}_i$  is updated to  $(\overline{F}_i \setminus \overline{F}_H) \cup \text{mincut}_H(r)$ .
- 2.  $|A_H| \leq |B_H|$ : In this case, H(r) is extended by the nodes and edges of H, the edges in  $B_H$  are removed from  $in_E(H(r))$  and the edges in  $A_H$  are added there. We also remove from D' all restricted structures belonging to D(H). If  $H \in D_1$ , the set  $\overline{F}_H$  is put back into  $\overline{G}_i$  so that H is not charged any more. For any structure  $H' \in D$  with  $H \in D(H')$  that was previously applied to case 1), we extend  $V(H'_1)$  by V(H) and remove all nodes in V(H) from  $V(H'_2)$  to repair the laminar property of D. Note that this does not increase the number of entry edges of  $H'_1$  or  $H'_2$ .
- 3.  $|C_H| \leq |B_H| < |A_H|$ : In this case, the nodes and edges from  $H(r) \cap H$  are removed from H(r) (i.e.,  $H(r) = H(r) \setminus H$ ). We also remove from D' all restricted structures belonging to D(H). If  $H \in D_1$ , the set  $\overline{F}_H$  is put back into  $\overline{G}_i$  so that H is not charged any more. For any structure  $H' \in D$  with  $H \in D(H')$  that was previously applied to case 1, we extend  $V(H'_2)$  by V(H) and remove all nodes in V(H) from  $V(H'_1)$ . Note that this does not increase the number of entry edges of  $H'_1$  or  $H'_2$ .

Clearly, after we have processed D', we again have a laminar family of restricted structures. Let D'' denote the set of restricted structures for which the removal of some edges in the set  $\bar{F}_H$  was made permanent in case 1, and let D''' denote the set of restricted structures that were excluded from H(r) as described in case 3. Let  $\bar{F}_i = \bigcup_{H \in D''} \operatorname{mincut}_H(r)$ . With this notation, the set of edges added to the global *h*-route cut in iteration *i* corresponds to  $F_i \cup \bar{F}_i$ , and we note that  $F_i \cup \bar{F}_i$  is still an *h*-route cut between  $t_i$  and *s* in  $G_i$ . We denote by  $G_{i+1} = G_i \setminus (F_i \cup \bar{F}_i)$  the graph entering the next iteration.

**2.6.3** Post-updating the credit and the levels. Finally, we show how to handle the level increase of those  $D_1$ -structures that are still cut by  $\overline{F}_i$ . For this we need the following lemma.

LEMMA 2.6. For every  $H \in D_1$  that was replaced by  $H_1$  and  $H_2$  as described in case 1 in the previous subsection, it holds for the original level  $\ell$  of H that

$$2^{2|in_{E}(H_{1})| + (\ell+1)} + 2^{2|in_{E}(H_{2})| + (\ell+1)} < 2^{2|in_{E}(H)| + \ell}$$

*Proof.* Note that in case 1 it holds that  $|in_E(H_1)| < |in_E(H)|$  and  $|in_E(H_2)| < |in_E(H)|$ . Hence,

$$2^{2|in_{E}(H_{1})|+(\ell+1)} + 2^{2|in_{E}(H_{2})|+(\ell+1)} \\ \leq (2^{2(|in_{E}(H)|-1)} + 2^{2(|in_{E}(H)|-1)})2^{\ell+1} \\ = 2^{2|in_{E}(H)|-1+(\ell+1)}$$

As the number of entry edges of  $H_1$  and  $H_2$  does not increase due to repairs of the laminar property for other restricted structures, the lemma follows.

Therefore, we can increase the level of every proper edge of  $H_1$  and  $H_2$  by one and pay for the credit of  $H_1$ and  $H_2$  by the credit of H.

Finally, we show how to make sure that all restricted structures in D are connected at the end. Consider some restricted structure  $H \in D$  that is cut into two or more connected components due to the removal of edges in  $F_i \cup \bar{F}_i$ . If  $H_1, \ldots, H_d$  are its connected components with at least 2 entry edges, then H is replaced in D by  $H_1, \ldots, H_d$  (connected components with at most 1 entry edge can be removed from consideration). The entry edges of the connected components are inherited from H and therefore,  $\sum_{j=1}^d in_E(H_j) \leq in_E(H)$ . Hence,

$$\sum_{j=1}^{d} 2^{2|in_E(H_j)| + \ell(H)} \le 2^{2|in_E(H)| + \ell(H)} = \phi(H)$$

which implies that we can keep the level of these structures at  $\ell(H)$  with the credit of H. Therefore, we can preserve the levels of the edges while making sure that all restricted structures in D are connected.

**2.7** Summing it up. Every time we add a subset F of edges to the global cut, we identify a set of edges whose x-volume is "large" (i.e., proportional to  $\sum_{e \in F} c(e)$ , up to a factor of  $O(h^5 2^{2h}(h + \log k))$  and we increase by one the level of each of them. This is implied by Lemma 2.5, Lemma 2.3 and description of the algorithm in the previous paragraphs. At the same time we guarantee in Lemma 2.1 that the level of every edge is at most  $2h + \log k$ .

THEOREM 2.1. The approximation ratio of the algorithm for the h-route single-source cut problem is  $O(h^5 2^{2h}(h + \log k)^2)$ .

COROLLARY 2.2. For every instance of the multicommodity single-source h-route flow problem,

$$\frac{F}{h} \le C \le O(h^5 2^{2h} (h + \log k)^2) F$$
(2.19)

where F is the size of the maximum h-route flow for the instance and C is the size of the minimum h-route cut.

### 3 Conclusion

In this paper we showed an approximate duality theorem for multiroute multicommodity flows and cuts for the single source case. It remains a challenging open problem whether it is possible to obtain an analogous result in the general setting with multiple sources. Currently, the best bound we have been able to obtain is of the order  $O(\log^{h} k)$  (when ignoring *h*-factors).

It is worth mentioning at this point that in the special case of uniform capacities (and multiple sources), an application of the ball growing technique yields an  $O(h^2 \log^2 k)$  approximation for the minimum *h*-route cut problem and thus, also an approximate duality: in iteration *i* we grow two balls for commodity *i* (unless it was already separated earlier, with respect to *h*-route cuts), one around  $t_i$  and the other around  $s_i$ , and we choose the one with smaller number of commodities inside. Once we have the ball, we perform a *classical cut*; the point is that we have to pay at most *h*-times more for the classical cut than for the *h*-route cut, under our assumptions. By performing the classical cut, we separate the problem into two completely independent parts and we proceed recursively with commodities inside the ball. By our choice of the ball the maximum level of the recursion is  $\log k$ at most. Using Lemma 2.5, the overall cost of all cuts performed by this algorithm is at most  $O(h^2 \log^2 k)$ -times larger than the optimum.

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