## Geometric Hitting Set for Segments of Few Orientations

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Abstract. We study several natural instances of the geometric hitting set problem for input consisting of sets of line segments (and rays, lines) having a small number of distinct slopes. These problems model path monitoring (e.g., on road networks) using the fewest sensors (the "hitting points"). We give approximation algorithms for cases including (i) lines of 3 slopes in the plane, (ii) vertical lines and horizontal segments, (iii) pairs of horizontal/vertical segments. We give hardness and hardness of approximation results for these problems. We prove that the hitting set problem for vertical lines and horizontal rays is polynomially solvable.

#### 1 Introduction

The set cover problem is fundamental in combinatorial optimization. It is NP-hard and has an  $O(\log n)$ -approximation algorithm, which is best possible (unless P=NP, [13]). Equivalently, set cover can be cast as a hitting set problem: given a collection,  $\mathcal{C}$ , of subsets of set U, find a smallest cardinality set  $H\subseteq U$  such that every set in  $\mathcal{C}$  contains at least one element of H. Numerous special instances of set cover/hitting set have been studied. Our focus in this paper is on geometric instances that arise in covering (hitting) sets of (possibly overlapping) line segments using the fewest points ("hit points"). A closely related problem is the "Guarding a Set of Segments" (GSS) problem [3,5,6,25], in which the segments may cross arbitrarily, but do not overlap. Since this problem is strongly NP-complete [5] in general, our focus is on special cases, primarily those in which the segments come from a small number of orientations (e.g., horizontal, vertical). We provide several new results on hardness and approximation algorithms.

We also are motivated by the path monitoring problem: given a set of trajectories, each a path of line segments in the plane, place the fewest sensors (points) to observe (hit) all trajectories. To gain theoretical insight into this challenging problem, we examine cleaner, but progressively harder, versions of hitting trajectory/line-like objects with points. If the trajectories are on a Manhattan road network, the paths are (possibly overlapping) horizontal/vertical segments.

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Alternatively, one wishes to place the fewest vendors or service stations in a road network to service a set of customer trajectories.

Our Results. We give complexity and approximation results for several geometric hitting set problems on inputs S of line "segments" of special classes, mostly of fixed orientations. The segments are allowed to overlap arbitrarily. We consider various cases of "segments" that may be bounded (line segments), semi-infinite (rays), or unbounded in both directions (lines). Our results are:

- (1) Hitting lines of 3 slopes in the plane is NP-hard (greedy is optimal for 2 slopes). For set cover with set size at most 3, standard analysis of the greedy algorithm gives an approximation factor of H(3) = 1 + (1/2) + (1/3) = (11/6), and there is a 4/3-approximation based on semi-local optimization [15]. We prove that the greedy algorithm in this special geometric case is a (7/5)-approximation.
- (2) Hitting vertical lines and horizontal rays is polytime solvable.
- (3) Hitting vertical lines and horizontal (even unit-length) segments is NP-hard. Our proof shows hitting horizontal and vertical unit-length segments is also NP-hard. We prove APX-hardness for hitting horizontal and vertical segments.
- (4) Hitting vertical lines and horizontal segments has a (5/3)-approximation algorithm. (This problem has a straightforward 2-approximation).
- (5) Hitting pairs of horizontal/vertical segments has a 4-approximation. Hitting pairs having one vertical and one horizontal segment has a (10/3)-approximation. These results are based on LP-rounding. More generally, hitting sets of k segments from r orientations has a  $(k \cdot r)$ -approximation algorithm.
- (6) We give (in the full paper) a linear-time combinatorial 3-approximation algorithm for hitting triangle-free sets of (non-overlapping) segments. A 3-approximation for this version of GSS was recently given [25] using linear programming.

Related Work. There is a wealth of related work on geometric set cover and hitting set problems; we do not attempt here to give an exhaustive survey. The point line cover (PLC) problem (see [23,27]) asks for a smallest set of lines to cover a given set of points; it is equivalent, via point-line duality, to the hitting problem for a set of lines. The PLC (and thus the hitting problem for lines) was shown to be NP-hard [30]; in fact, it is APX-hard [7] and Max-SNP Hard [28]. The problem has an  $O(\log OPT)$ -approximation (e.g., greedy – see [26]); in fact, the greedy algorithm for PLC has worst-case performance ratio  $\Omega(\log n)$  [16].

Hassin and Megiddo [22] considered hitting geometric objects with the fewest lines having a small number of distinct slopes. They observed that, even for covering with axis-parallel lines, the greedy algorithm has an approximation ratio that grows logarithmically. They gave approximations for the problem of hitting horizontal/vertical segments with the fewest axis-parallel lines (and, more generally, with lines of a few slopes). Gaur and Bhattacharya [19] consider covering points with axis-parallel lines in d-dimensions; they give a (d-1)-approximation

based on rounding the corresponding linear program (LP) formulation. Many other stabbing problems (find a small set of lines that stab a given set of objects) have been studied; see, e.g., [14,17,20,21,26,29].

A recent paper [25] gives a 3-approximation for hitting sets of "triangle-free" segments. Brimkov et al. [3,5,6] have studied the hitting set problem on line segments, including various special cases; they refer to the problem as "Guarding a Set of Segments", or GSS. GSS is a special case of the "art gallery problem:" place a small number of "guards" (e.g., points) so that every point within a geometric domain is "seen" by at least one guard [32,34]. Brimkov et al. [4] provide experimental results for three GSS heuristics, including two variants of "greedy," showing that in practice the algorithms perform well and are often optimal or very close to optimal. They prove, however, that, in theory, the methods do not provide worst-case constant-factor approximation bounds. For the special case that the segments are "almost tree (1)" (a connected graph is an almost tree (k) if each biconnected component has at most k edges not in a spanning tree of the component), a  $(2 - \varepsilon)$ -approximation is known [3].

An important distinction between GSS and our problems is that allow over-lapping (or partially overlapping) segments (rays, and lines), while, in GSS, each line segment is maximal in the input set of line segments (the union of two distinct input segments is not a segment). A special case of our problem is interval stabbing on a line: Given a set of segments (intervals), arbitrarily overlapping on a line, find a smallest hitting set of points that hit all segments. A simple sweep along the line solves this problem optimally: when a segment ends, place a point and remove all segments covered by that point.

If no point lies within three or more objects, then the hitting set problem is an edge cover problem in the intersection graph of the objects. In particular, if no three segments pass through a common point, the problem can be solved optimally in polynomial time. (This implies that in an arrangement of "random" segments, the GSS problem is almost surely polynomially solvable; see [3]).

Hitting axis-aligned rectangles is related to hitting horizontal and vertical segments. Aronov, Ezra, and Sharir [2] provide an  $O(\log \log OPT)$ approximation for hitting set for axis-aligned rectangles (and axis-aligned boxes in 3D), by proving a bound of  $O(\varepsilon^{-1}\log\log(\varepsilon^{-1}))$  on the  $\varepsilon$ -net size of the corresponding range space. The connection between hitting sets and  $\varepsilon$ nets [8,11,12,18] implies a c-approximation for hitting set if one can compute an  $\varepsilon$ -net of size  $c/\varepsilon$ ; recent major advances [1,33] on lower bounds on  $\varepsilon$ -nets imply that associated range spaces (rectangles and points, lines and points, points and rectangles) have  $\varepsilon$ -nets of size superlinear in  $1/\varepsilon$ . Remarkably, improved  $(1+\varepsilon)$ approximation algorithms (i.e., PTASs) for certain geometric hitting set and set cover problems are possible with simple local search. For example, Mustafa and Ray [31] give a local search PTAS for computing a smallest subset, of a given set of disks, that covers a given set of points. Hochbaum and Maas [24] used grid shifting to obtain a much earlier PTAS for the minimum unit disk cover problem when disks can be placed anywhere in the plane, not restricted to a discrete input set.

#### 2 Hitting Segments

Suppose S is a set of line segments in the plane. If all segments are horizontal, then we can compute an optimal hitting set by independently solving the interval stabbing problem along each of the horizontal lines determined by the input.

If the segments are of two different orientations (slopes), then the problem becomes significantly harder. Without loss of generality, assume the segments are horizontal and vertical. We show the problem is hard even if the axis-parallel segments are all the same length. This result (Corollary 1) is a consequence of an even stronger result, Theorem 4, which we establish in Sect. 5.

We get an immediate 2-approximation algorithm by solving optimally each of the two orientations, and using the union of the hitting points for both. (This generalizes to a k-approximation for hitting sets of segments of k orientations).

#### 3 Hitting Lines

When S is a set of n lines in the plane, greedy gives an  $O(\log OPT)$  approximation factor; any approximation factor better than logarithmic would be quite interesting. (See [16,27].) If the lines have only 2 slopes, then greedy is optimal.

#### 3.1 Hardness of Hitting Lines of 3 Slopes in 2D

We prove that the hitting set problem is NP-hard when lines have more than two orientations. Consider the dual formulation: (3-SLOPE-LINE-COVER, 3SLC) Find a minimum-cardinality set of non-vertical lines to cover a set P of points (duals to the set S of lines), which are known to lie on three vertical lines.

We prove (in the full paper) that 3SLC is NP-hard from 3-SAT, using variable gadgets and clause gadgets that rely on carefully placed points on three vertical lines. "Propagation" of variable assignments is determined by triples of points on distinct vertical lines coverable by a single line.

**Theorem 1.** The problem 3SLC is NP-complete.

# 3.2 Analysis of the Greedy Hitting Set Algorithm for Lines of 3 Slopes in 2D

If no point lies in more than k sets, the greedy algorithm's approximation factor is  $H(k) = \sum_{i=1}^{k} (1/i)$  [10]. This property holds for lines of 3 slopes with k = 3, giving a greedy approximation factor H(3) = 11/6. We give a new analysis, exploiting the special geometric structure of the hitting set problem for lines of 3 slopes, to obtain an approximation factor (7/5); see the full paper.

#### 3.3 Axis-Parallel Lines in 3D

While in 2D the hitting set problem for axis-parallel lines is easily solved, in 3D we prove (in the full paper) that the corresponding hitting set problem is NP-hard, using a reduction from 3-SAT.

**Theorem 2.** Hitting set for axis-parallel lines in 3D is NP-complete.

#### 4 Hitting Rays and Lines

Hitting rays is "harder" than hitting lines, since any instance of hitting lines has a corresponding equivalent instance as a hitting rays problem (place the apices of the rays far enough away that they are effectively lines). Unlike lines, there can be many different collinear rays. Divide collinear rays into two groups according to the direction they point along the containing line,  $\ell$ ; because of nesting, we need keep only one of the rays pointing in each of the two directions along  $\ell$ .

We show that the special case with horizontal rays and vertical lines (abbreviated HRVL) is exactly solvable in polynomial time:

**Theorem 3.** The hitting set problem for vertical lines and horizontal rays can be solved in O(nT) time, where n is the number of entities and T is the time for computing a maximum matching in a bipartite graph with n nodes.

We begin with a high-level overview of the algorithm. A point can cover at most 3 objects: a vertical line, a left-facing ray, and a right-facing ray. This requires the two rays to intersect in a segment, and the vertical line to intersect this segment. We call these points 3-hitters. We can compute the maximum possible number of 3-hitters via maximum matching in a bipartite graph, where edges represent intersections between vertical lines and horizontal segments. We prove there exists an optimal solution with this maximum number of 3-hitters. The algorithm performs a sweep inward from the left and right, finding a suitable set of 3-hitters, ensuring the remaining lines have the best possible chance to share a point with the remaining rays. Once everything that is 3-hit is removed, the remaining objects intersect in at most pairs. So we can finish the hitting by solving an edge cover problem between rays and lines. We prove this is optimal.

We now give additional algorithmic and proof details. We call a horizontal ray to the left (resp., right) an *l-ray* (resp. *r-ray*). In this section, all lines are vertical. If two collinear rays are disjoint, we shift one ray slightly up or down, so no two disjoint rays are collinear. These rays cannot be covered by a single point, so this does not fundamentally alter the optimal solution.

If a line only contains one ray, we add a ray to pair with it. For example, if an r-ray intersects no l-ray, we add an intersecting l-ray whose right endpoint is to the right of all vertical input lines. This additional ray won't change the optimal solution. If an l-ray and r-ray intersect, their intersection is a segment. Since all rays intersect another ray, we represent each pair of rays by their segment.

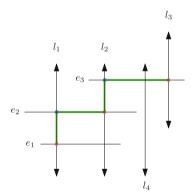
Let H and V denote the number of segments and lines respectively. Any solution requires V points to cover the lines. Those points can help "hit" segments in two possible ways: (1) Place a point on the segment. We call the corresponding line a 3-hitter and say the segment is 3-hit by the line. (2) Hit each ray outside its intersecting segment. This requires two points. We call the left(right) line an l-hitter(r-hitter). We say the segment is double-hit by those two lines.

Let  $v_1$  and  $v_2$  be the number of segments hit by the V points in the first and second ways respectively. Then the number of points in the solution is  $H + V - v_1 - v_2$ . We must put a point on each line to hit as many segments as possible.

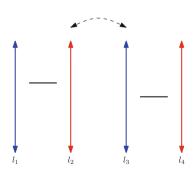
Given an instance of HRVL, we can calculate the maximum number of 3-hitters. We construct a bipartite graph G where one set of nodes is the lines and the other set of nodes is the segments. There is an edge between two nodes if and only if the line and segment they represent intersect. Maximum matching in a bipartite graph is solvable in polynomial time. A matching in the graph represents a set of independent intersections in the corresponding HRVL. That is, a set of M edges in a matching corresponds to a way to cover M segments and M lines with M points. These are coverages of type 1. The following intuitive lemma shows it is better to adopt the first way to hit segment.

**Lemma 1.** For any instance of HRVL, there is a maximum matching between lines and segments that can be augmented to be an optimal solution.

**Proof Sketch.** We use contradiction. Let  $v_1^*$  be the largest  $v_1$  for any minimum hitting set. We assume that  $v_1^*$  is less than m, the cardinality of the maximum matching between lines and segments. Thus, there is an augmenting path in the bipartite graph G, such as the green path in Fig. 1. Because the current solution is optimal, any augmenting path cannot improve it. This allows us to infer some properties of the first segment and the last line on the augmenting path. We consider the augmenting path P with the shortest length and the shortest horizontal distance between the last two lines. Then by case analysis on path P, we argue there exists another augmenting path that increases  $v_1^*$  or violates a minimality condition of P. The proof appears in the full paper.



**Fig. 1.** A green augmenting path: the matching size increases by replacing blue circles with red crosses (Color figure online).



**Fig. 2.** Swapping  $l_2$  and  $l_3$  makes both of them more useful (Color figure online).

**Lemma 2.** Given an optimal solution S, there is an optimal solution S' that has the same set of 3-hitters as S, with its l-hitters all left of its r-hitters.

*Proof.* In Fig. 2 two segments are double-hit by two pairs of lines; the blue lines are l-hitters and the red lines are r-hitters. When we pair  $l_1$  to  $l_3$  and pair  $l_2$  to  $l_4$ , the two segments are still double-hit, because this swap moves the l-hitter further left and the r-hitter further right. A sequence of such swaps moves all l-hitters to the left of all r-hitters.

In the full paper, we give details of an algorithm for HRVL. The algorithm maximizes the number of 3-intersections and "balances" the remaining lines between the left and right sides as much as possible. In the algorithm, we test the criticality of a line: given the previous choices, if a *critical* line is not used as a 3-hitter, there is no way to extend the previous choices to a maximum matching.

We now argue that the left-right-balanced approach gives lines that obey Lemma 2. Let S be the solution given by our HRVL algorithm, and let S' be an optimal solution with the maximum set of 3-hitters. We know that S and S' have the same number of 3-hitters. Let D and D' denote the lines left behind (not 3-hitters) in S and S' respectively. We order lines in D and D' from left to right. Let k be  $\lfloor \frac{|D|}{2} \rfloor$ . Thus, there are at most k pairs of double-hitters in S and S'. Let  $lh_i$  (resp.,  $lh'_i$ ) be the ith line of D (resp., D').

Given a solution P and a line l, let E(l, P) denote the number of segments on the left side of l not hit by 3-hitters in P. A line having more segments on its right side is more likely to be an l-hitter. We will show that line  $lh_i$  is at least as capable of being an l-hitter as is line  $lh'_i$ .

$$E(lh_i, S) \le E(lh'_i, S'), \quad i = 1, 2, ..., k$$
 (1)

We split the proof of (1) into two lemmas; proofs appear in the full paper.

**Lemma 3.**  $lh_i$  cannot be on the right side of  $lh'_i$ , i = 1, 2, ..., k.

An immediate result from this lemma is

$$E(lh_i, S') \le E(lh_i', S'). \tag{2}$$

Given a solution P and a line l, let C(l, P) denote the number of segments on the left side of l that have been 3-hit in P. Let N(l) be the total number of segments on the left of line l. The following lemma shows that the segments that S leaves to be used as 2-hitters are the segments that are easier to double-hit.

**Lemma 4.** 
$$C(lh_i, S) \geq C(lh_i, S'), i = 1, 2, ..., k.$$

Therefore we obtain

$$E(lh_i, S) = N(lh_i) - C(lh_i, S)$$
  

$$\leq N(lh_i) - C(lh_i, S') = E(lh_i, S') \leq E(lh'_i, S').$$

### 5 Hitting Lines and Segments

#### 5.1 Hardness

**Theorem 4.** Hitting set for horizontal unit segments and vertical lines is NP-complete.

*Proof.* The reduction is from 3SAT. See Fig. 3.

Each variable is represented by a collinear connected set of horizontal unit segments, and each clause is represented by a red vertical line that intersects appropriate pairs of horizontal variable segments (if that variable occurs in a clause) or just single segments (in case a variable does not occur in a clause). Setting appropriate parities for the literals in a clause is achieved by appropriate horizontal shifting of the segments, as shown in the figure. This results in a construction in which the only place where three of the elements (segments or lines) can be hit involves a vertical line representing a clause, corresponding

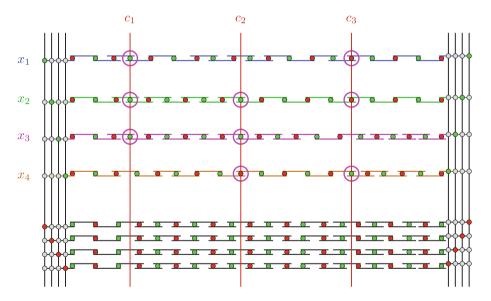


Fig. 3. A set of horizontal unit segments and vertical lines that represents the 3SAT instance  $I = (x_1 \lor x_2 \lor x_3) \land (x_2 \lor x_3 \lor \overline{x_4}) \land (\overline{x_1} \lor \overline{x_2} \lor x_4)$ . For better visibility, collinear segments are slightly shifted vertically, with red and green points indicating overlapping segments. In an optimal hitting set, the point covering a *labeled* horizontal segment induces a truth value for the corresponding variable: selecting one of its grey points (e.g., in the indicated green manner) assigns a value of "true"; selecting a red point, a value of "false". Overall, truth assignments for each variable correspond to a set of green or red points, respectively. Literals occurring in clauses are indicated by magenta circles; these are the only places where a point can hit three segments or lines at once (Color figure online).

to literals occurring in the respective clauses. (These are indicated by magenta circles in the figure). The N elements excluding the red vertical lines associated with clauses are called variable components.

We show that any feasible hitting set with exactly N/2 points induces a truth assignment and vice versa. There is no point that hits more than two of the variable components at once. Therefore, stabbing all N of them requires at least N/2 points, and any solution consisting of exactly N/2 points must hit each variable component exactly once. Consequently, the black vertical lines and the black collinear sets of connected horizontal segments in Fig. 3 may be reordered so that, without loss of generality, a solution with exactly N/2 points does not pick any of the gray points. Eliminating the gray points results in a natural partition of the instance into point-disjoint even-cardinality loops of variable components for each variable, where the points in each loop alternate between red and green. Thus any solution of size N/2 hitting the variable components must select all red or all green points from each variable's loop, corresponding to a truth assignment. We get an overall feasible hitting set if and only if the points also stab the vertical clause lines, corresponding to a satisfying truth assignment.

After appropriate vertical scaling, we can replace the vertical lines by vertical unit segments, immediately giving the following corollary.

**Corollary 1.** Deciding if there exists a set of k points in the plane that hit a given set S of unit-length axis-parallel segments is NP-complete.

We show in the full paper, using a reduction from MAX-2SAT(3), that the hitting set problem is APX-hard for vertical lines and horizontal segments.

#### 5.2 Approximation

We give a 5/3-approximation for hitting a set V of vertical lines and a set H of horizontal segments. We start by looking at the lower bounds: v = |V| is the number of vertical lines. It is a lower bound. Let h be the lower bound on hitting horizontal segments only. We can compute h exactly; it is the minimum number of hit points for the horizontal segments (computed on each horizontal line). At any stage of the algorithm, we let h and v be the current values of these lower bounds for hitting the current (remaining unhit) sets H and V.

In stage 1, we place two kinds of points:

- (a) We place hitting points on vertical lines that reduce h (and v) by one. These points are "maximally productive" since no single hitting point can do more than to reduce h and v each by one. As vertical lines are hit, we remove them from V. Similarly, as horizontal segments are hit, we remove them from H.
- (b) Look for pairs (if any) of points, on the same horizontal line and on two vertical lines (from among the current set V), that decrease h by one.

Let  $k_1$  and  $k_2$  be the number of type(a) and type(b) points placed in this stage, respectively. Therefore, for the remaining instance, the lower bound h decreases by  $k_1 + k_2/2$ , and v decreases by  $k_1 + k_2$ .

In stage 2, we now have a set of vertical lines V and horizontal segments H such that no single point at the intersection of a vertical line and a horizontal segment (or segments) reduces h, and no pair of points on two distinct vertical lines reduces h.

**Lemma 5.** For such sets V and H as in stage 2, an optimal hitting set has size at least v + h, where v = |V| and h is the minimum number of points to hit H.

*Proof.* The hit points we place on V (one per line) might conceivably decrease h. We claim that this cannot happen. Assume to the contrary that it happens. Let  $\{q_1, q_2, \ldots, q_K\}$  be a minimum-cardinality set such that each of them is on some line of V from left to right and h is decreased by 1 after placing the set. Since the set is minimum, the points in it should be on a horizontal line L.

Since we have found all productive points and pairs of points in stage 1, K should be at least 3. Consider the hit point  $q_2$ . The segments on L that are not hit by  $q_2$  are either completely left or right of  $q_2$ ; let  $H_l$  and  $H_r$  be the corresponding sets. Points to the left of  $q_2$  do not hit  $H_r$ , and points to the right of  $q_2$  to not hit  $H_l$ . If adding  $q_1$  decreases H, that means  $q_1$  and  $q_2$  is a productive pair, which should be found in stage 1; otherwise this means that the point  $q_1$  is unnecessary, contradicting the minimality of K.

**Theorem 5.** There is a polynomial-time 5/3-approximation algorithm for geometric hitting set for a set of vertical lines and horizontal segments.

*Proof.* The total number of points selected by our algorithm is  $k_1 + k_2$  from the first stage and  $h - k_1 - k_2/2 + v - k_1 - k_2$  from the second stage. By Lemma 5, the points chosen in stage 2 is a lower bound on the cost of an optimal solution:

$$h - k_1 - k_2/2 + v - k_1 - k_2 \le OPT. \tag{3}$$

We also have  $h \leq OPT$  and  $v \leq OPT$ . There are two cases.

- (i)  $k_1 + k_2 \le 2/3 \cdot OPT$ : In this case we select at most  $2/3 \cdot OPT$  points in Stages 1, and we use (3) to bound the number of points selected in Stage 2. We conclude that our algorithm selects at most  $5/3 \cdot OPT$  points.
- (ii)  $k_1 + k_2 > 2/3 \cdot OPT$ : The total number of points selected by our algorithm is  $h k_1 k_2/2 + v \le 2 \cdot OPT (k_1 + k_2/2)$ . Since  $k_1 + k_2/2 \ge k_1/2 + k_2/2 > 1/3 \cdot OPT$ , we obtain a 5/3-approximation in this case as well.

**Theorem 6.** There is a polynomial-time 5/3-approximation algorithm for geometric hitting set for a set of vertical (downward) rays and horizontal segments.

*Proof.* The 2-stage approximation algorithm described above works for this case as well. The key observation is that among any set of collinear downward rays, we may remove all but the one with the lowest apex from the instance. Therefore after Stage 1, the hitting points we place on the rays not yet hit will not decrease h. The argument is analogous to that in Lemma 5.

## 6 Hitting Pairs of Segments

We consider now the hitting set problem for inputs that are *unions* of two segments, one horizontal and one vertical. While we are motivated by pairs (and larger sets) of segments that form paths, our methods apply to general pairs of segments, which might meet to form an "L" shape, a "+", or a "T" shape, or they may be disjoint. This hitting set problem is NP-hard, since it generalizes the case of horizontal and vertical segments.

**Theorem 7.** For objects that are unions of a horizontal and a vertical segment, the hitting set problem has a polynomial-time 4-approximation.

**Proof Sketch.** For ease of discussion, we call the union of two segments an "L." We use a method similar to those used in [9,20]. Solve the natural set-cover linear programming (LP) relaxation. Create two new problems: one that has only the horizontal piece of some of the Ls and another that has only the vertical pieces of the remaining Ls. Place an L into the vertical problem if the LP vertical segment has value at least 1/2, and into the horizontal problem otherwise. Solve the two new problems in polynomial time using the combinatorial method for the 1D problem, or solving the LPs, which are totally unimodular, and thus will return integer solutions. Take all the points selected by either new problem. We prove in the full paper that these points are a 4-approximation.

The above idea naturally extends to a 4-approximation for the weighted version of the problem. For unions consisting of at most k segments drawn from r orientations, the approach yields a  $(k \cdot r)$ -approximation. Using similar methods and a stronger version of Theorem 5, we also have the following (see full paper):

**Theorem 8.** For objects that are unions of a horizontal segment and a vertical line, the hitting set problem has a polynomial-time 10/3-approximation.

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