Minimum Scan Cover with Angular Transition Costs

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— Abstract -

We provide a comprehensive study of a natural geometric optimization problem motivated by questions in the context of satellite communication and astrophysics. In the problem MINIMUM SCAN COVER WITH ANGULAR COSTS (MSC), we are given a graph G that is embedded in Euclidean space. The edges of G need to be scanned, i.e., probed from both of their vertices. In order to scan their edge, two vertices need to face each other; changing the heading of a vertex takes some time proportional to the corresponding turn angle. Our goal is to minimize the time until all scans are completed, i.e., to compute a schedule of minimum makespan.

We show that MSC is closely related to both graph coloring and the minimum (directed and undirected) cut cover problem; in particular, we show that the minimum scan time for instances in 1D and 2D lies in $\Theta(\log \chi(G))$, while for 3D the minimum scan time is not upper bounded by $\chi(G)$. We use this relationship to prove that the existence of a constant-factor approximation implies P = NP, even for one-dimensional instances. In 2D, we show that it is NP-hard to approximate a minimum scan cover within less than a factor of $^{3}/_{2}$, even for bipartite graphs; conversely, we present a $^{9}/_{2}$ -approximation algorithm for this scenario. Generally, we give an O(c)-approximation for k-colored graphs with $k \leq \chi(G)^{c}$. For general metric cost functions, we provide approximation algorithms whose performance guarantee depend on the arboricity of the graph.

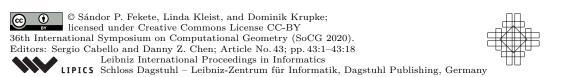
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1 Introduction

Many problems of geometric optimization arise from questions of communication, where different locations need to be connected. For physical networks, the cost of a connection corresponds to the geometric distance between the involved vertices, e.g., the length of an electro-optic link. Often wireless transmissions may be used instead; however, for ultralong distances such as in space, this requires focused transmission, e.g., by communication partners facing each other with directional, paraboloid antennas or laser beams. This makes it impossible to exchange information with multiple partners at once; moreover, a change of communication partner requires a change of heading, which is costly in the context of space missions with limited resources, making it worthwhile to invest in a good schedule.

With the advent of satellite swarms of ever-growing size, problems of this type are of increasingly practical importance for ensuring communication between spacecraft. They also come into play when astro- and geophysical measurements are to be performed, in which groups of spacecraft can determine physical quantities not just at their current locations, but also along their common line of sight.

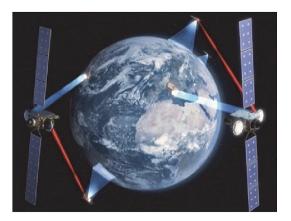


Figure 1 Artist's rendition of the European Data Relay Satellite constellation architecture. Note the intersatellite links shown in red. (Image credit: ESA).

We consider an optimization problem arising from this context: How can we schedule a given set of intersatellite communications, such that the overall timetable is as efficient as possible? In particular, we study the question of a MINIMUM SCAN COVER WITH ANGULAR COSTS (MSC), in which we need to establish a collection of connections between a given set of locations, described by a graph G=(V,E) that is embedded in space. For any connection (or scan) of an edge, the two involved vertices need to face each other; changing the heading of a vertex to cover a different connection takes an amount of time proportional to the corresponding turn angle. Our goal is to minimize the time until all tasks are completed, i.e., compute a geometric schedule of minimum makespan.

In this paper, we provide a comprehensive study of this problem. We show that MSC is closely related to both graph coloring and the minimum (directed and undirected) cut cover problem. We also provide a number of hardness results and approximation algorithms for a variety of geometric scenarios; see Section 1.2 for an overview.

1.1 Problem definition: Minimum Scan Cover

In the abstract version of MINIMUM SCAN COVER, denoted by A-MSC, we are given a simple graph G=(V,E) and a metric cost function $\alpha:\{(e,e')\in E\times E\mid e\cap e'\neq\emptyset\}\to\mathbb{R}^+$ that describes the cost for switching between two incident edges uv,vw for the common vertex v. A scan cover is an assignment $S:E\to\mathbb{R}^+$, such that for every vertex v and every pair of incident edges uv and vw it holds that

$$|S(uv) - S(vw)| \ge \alpha(uv, vw).$$

This condition provides sufficient time for the vertices to face each other. We seek a scan cover that minimizes the scan time $\max_{e \in E} S(e)$. Note that A-MSC generalizes the Path-TSP (see Observation 8), so the problem becomes intractable if the cost function α is not metric.

Given the practical motivation, our main focus is the (GEOMETRIC) MINIMUM SCAN COVER PROBLEM (MSC), for which every vertex v corresponds to a point in \mathbb{R}^d , $d \in \{1, 2, 3\}$, the turn cost $\alpha(uv, vw)$ of v from uv and vw is the (smaller) angle at v between the segments uv and vw. Figure 2 illustrates a minimum scan cover for a point set in the plane that can be scanned in 300° with eleven discrete time steps.

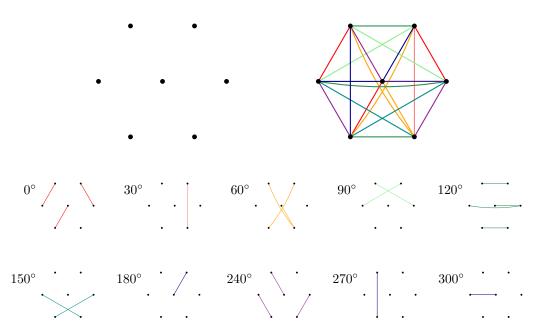


Figure 2 (Left) A set of seven points in \mathbb{R}^2 , for which the complete graph K_7 needs to be scanned. (**Bottom**) A sequence of edge scans; note how some edges can be scanned in parallel.

In fact, a scan cover is completely determined by an edge order: For each edge sequence e_1, \ldots, e_m , the best scan cover that scans the edges in this order can be computed by

$$S(e_1) = 0$$
 and $S(e_i) = \max\{S(e_i) + \alpha(e_i, e_i) | j : j < i, e_i \cap e_i \neq \emptyset\}$ for $i > 1$.

In some settings, we may be given an initial heading of each vertex. However, the cost of changing from the initial heading to any other is usually negligible compared to the cost of the remaining schedule. In fact, any C-approximation without initial headings yields a (C+1)-approximation for the variant with initial headings, as turning from the initial heading to any edge via a smallest angle is not more expensive than the minimum makespan.

1.2 Overview of results and organization

In Section 2, we show that the MSC in 1D corresponds to a minimum directed cut cover and has a strong correlation to the chromatic number. We provide an improved upper bound of $\lceil \log_2 \chi(G) + \frac{1}{2} \log_2 \log_2 \chi(G) + 1 \rceil$ (Theorem 1 and Corollary 2) for the minimum directed cut cover number, which is essentially tight in general; even for directed acyclic graphs corresponding to minimum scan covers (Lemma 1) this is in the right order of magnitude. This implies that, unless P = NP, there exists no constant-factor approximation even in 1D (Theorem 3). Nevertheless, we show that instances in which the underlying graphs are bipartite or complete graphs can be solved in polynomial time (Observations 3 and 4).

In Section 3, we consider the problem in 2D and show that it is NP-hard to approximate minimum scan covers of bipartite graphs better than $^3/_2$ (Theorem 4). Furthermore, we provide absolute and relative bounds. On the one hand, every bipartite graph in 2D has a scan cover of length 360° (Theorem 5). On the other hand, we present a $^9/_2$ -approximation algorithm (Theorem 6). More generally, we present an O(c)-approximation for a k-colored graph with $k \leq \chi(G)^c$ (Theorem 7). This has immediate consequences for several interesting graph classes, e.g., the scan time of graphs in 1D and 2D lies in $\Theta(\log_2 \chi(G))$ and there exist constant factor approximations (Corollaries 8 and 9).

In Section 4, we consider MSC in 3D and the abstract version A-MSC. We show that in contrast to 2D, the length of a minimum scan cover in 3D may exceed $O(\log_2 n)$ (Observation 11). Complementary to the fact that A-MSC for stars is equivalent to path-TSP and thus NP-hard, we provide a 2.5-approximation of A-MSC for trees (Theorem 10). This yields an O(A)-approximation for every graph with arboricity A (Theorem 11).

1.3 Related work

The use of directional antennas has introduced a number of geometric questions. Carmi et al. [9] study the α -MST problem, which arises from finding orientations of directional antennas with α -cones, such that the connectivity graph yields a spanning tree of minimum weight, based on bidirectional communication. They prove that for $\alpha < \pi/3$, a solution may not exist, while $\alpha \ge \pi/3$ always suffices. See Aschner and Katz [7] for more recent hardness proofs and constant-factor approximations for some specific values of α .

Many other geometric optimization problems deal with turn cost. Arkin et al. [5, 6] show hardness of finding an optimal milling tour with turn cost, even in relatively constrained settings, and give a 2.5-approximation algorithm for obtaining a cycle cover, yielding a 3.75-approximation algorithm for tours. The complexity of finding an optimal cycle cover in a 2-dimensional grid graph was stated as *Problem 53* in *The Open Problems Project* [11] and shown to be NP-complete in [12], which also provides constant-factor approximations; practical methods and results are given in [13], and visualized in the video [8].

Finding a fastest roundtrip for a set of points in the plane for which the travel time depends only on the turn cost is called the $Angular\ Metric\ Traveling\ Salesman\ Problem$. Aggarwal et al. [1] prove hardness and provide an $O(\log n)$ approximation algorithm for cycle covers and tours that works even for distance costs and higher dimensions. For the abstract version on graphs in which "turns" correspond to weighted changes between edges, Fellows et al. [16] show that the problem is fixed-parameter tractable in the number of turns, the treewidth, and the maximum degree. Fekete and Woeginger [14] consider the problem of connecting a set of points by a tour in which the angles of successive edges are constrained.

Our paper also draws connections to other graph optimization problems. In particular, for each point in time, the set of scanned edges induces a bipartite graph. Therefore, one approach for scanning all edges of the given graph is to partition it into a small number of bipartite graphs, each corresponding to the set of edges separated by the *cut* induced by a partition of vertices into two non-trivial sets. This problem is also known as the MINIMUM CUT COVER PROBLEM: Find the minimum number of cuts to cover all edges of a graph. Loulou [22] shows that for complete graphs, an optimal solution consists of $\lceil \log_2 |V| \rceil$ cuts. Motwani and Naor [23] prove that, unless P = NP, the problem on general graphs is not approximable within 1.5 of the optimum, or $OPT + \varepsilon \log |V|$ for some $\varepsilon > 0$ in absolute terms, due to a direct relationship with graph coloring. Hoshino [18] considers practical methods based on integer programming and heuristics for cut covers. Chuzhoy and Khanna [10] show that the directed version of covering a directed graph by the minimum number of directed cuts is also an NP-hard problem.

On the application side, Korth et al. [20] describe the use of tomography (i.e., determining physical phenomena by measuring aggregated effects along a ray between two sensors) in the context of astrophysics. Using multiple sensors (e.g., satellites) for performing efficient measurements is one of the motivations for the algorithmic work in this paper. Scheduling satellite communication has received a growing amount of attention, corresponding to the increasing size of satellite swarms. See Krupke et al. [21] for a recent overview.

In the context of scheduling, Allahverdi et al. [2, 3, 4] provide a nice and comprehensive survey on scheduling variants with sequence-dependent setup costs. Sotskov et al. [25] consider a scheduling variant that can directly be expressed as vertex coloring.

2 One-dimensional point sets

In the one-dimensional case, all vertices lie on a single line L. Therefore, an instance can be described by a graph G=(V,E) and a total order of the vertices $<_L$ on L. We assume this line to be horizontal, so vertices face either left or right when scanning an edge. Moreover, scan times can be restricted to discrete multiples of 180° . This allows us to encode the headings of a vertex v at these time steps by a 0-1-vector s(v), where a right heading is denoted by 0, and a left one by 1; we denote by $s_i(v)$ the ith bit of s(v). Then a scan cover with N steps of $(G,<_L)$ is an assignment $s\colon V\to \{0,1\}^N$, such that for every edge $uv\in E$, $u<_L v$, there exists an index $i\in [N]$ with $s_i(u)=0$ and $s_i(v)=1$. The value of such a scan cover is clearly $180^{\circ}(N-1)$. For an example, consider Figure 3.

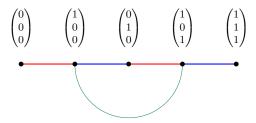


Figure 3 This instance can be scanned in three steps. However, two steps are not sufficient because the edges of a monotone path would need to be scanned in alternating time steps; making it impossible to scan the green edge.

2.1 Bounds based on chromatic number and cut cover number

In the following, we establish a strong relationship between the length of a MSC in 1D and the chromatic number $\chi(G)$, which is closely linked to the cut cover number c(G) of the involved graph G = (V, E), i.e., the size of a smallest partition of the edge set into bipartite graphs. Motwani and Naor [23] show that

$$c(G) = \lceil \log_2 \chi(G) \rceil.$$

Because the scanned edges in each time step form a bipartite graph, a scan cover induces a cut cover. However, the resulting bipartite graphs have the additional property that for each vertex all neighbors are either smaller or larger with respect to $<_L$. Thus, not every cut cover corresponds to a scan cover. However, scan covers correspond to directed cut covers of the directed graph, induced by orienting the edges from left to right. Watanabe et al. [26] bound the directed cut cover number $\vec{c}(G)$ of a directed graph G:

$$\vec{c}(G) \le \lceil \log_2 \chi(G) \rceil + \lceil \log_2 \lceil \log_2 \chi(G) + 1 \rceil \rceil$$

We improve this bound by showing an upper bound for the size of a smallest scan cover in terms of the chromatic number (and the cut cover number); this bound is best possible for the directed cut cover number as we explain later.

▶ **Theorem 1.** For every graph G with $\chi(G) \geq 2$ and every ordering $<_L$ of the vertices, there exists a scan cover of $(G, <_L)$ with N steps such that

$$N \le \lceil \log_2 \chi(G) + \frac{1}{2} \log_2 \log_2 \chi(G) + 1 \rceil$$

Proof. Consider a coloring of G with $C := \chi(G)$ colors and choose an N large enough such that $C \leq \binom{N}{\lfloor N/2 \rfloor}$. For $k := \lfloor \frac{N}{2} \rfloor$, we consider the set of vectors $\{0,1\}_k^N$ of length N with exactly k many 1's. We define a scan cover $s : V \to \{0,1\}_k^N$, such that for all vertices of the same color, we assign the same vector, while vertices of different color obtain different vectors. Such an assignment exists, because the number of vectors, i.e., $\binom{N}{\lfloor N/2 \rfloor}$, is at least as large as the number of colors.

To see that s is a scan cover, consider a fixed but arbitrary edge uv of G. Because the vectors s(u) and s(v) differ but have the same number of 1's, they are *incomparable*, i.e., there exist i and j such that $s_i(u) = 0$, $s_i(v) = 1$ and $s_j(u) = 1$, $s_j(v) = 0$. Therefore, depending on the ordering of u and v on L, the edge uv is either scanned in step i or j.

It remains to show that defining $N := \lceil \log_2 C + \frac{1}{2} \log_2 \log_2 C + 1 \rceil$ satisfies $C \leq \binom{N}{\lfloor N/2 \rfloor}$. By a variant of Stirling's formula [24], it holds that

$$e^{1/(12n+1)} \le \frac{n!}{\sqrt{2\pi n}(n/e)^n} \le e^{1/(12n)}.$$

This implies that $\binom{N}{\lfloor N/2 \rfloor} \ge \sqrt{\frac{2}{\pi N}} \cdot 2^N \cdot e^{\frac{-1}{4N-1}}$, so it suffices to guarantee

$$C \leq \sqrt{\frac{2}{\pi N}} \cdot 2^N \cdot e^{\frac{-1}{4N-1}} \iff \log_2 C \leq N + \frac{1}{2} (1 - \log_2 \pi - \log_2 N) - \frac{1}{4N-1} \log_2 e.$$

If
$$C \geq 3$$
, this holds for $N = \lceil \log_2 C + \frac{1}{2} \log_2 \log_2 C + 1 \rceil \geq 3$; in case of $C = 2$, it holds that $N = \lceil \log_2 C + \frac{1}{2} \log_2 \log_2 C + 1 \rceil = 2$, and thus $C \leq \binom{N}{\lfloor N/2 \rfloor}$.

Note that the assigned vectors in the proof of Theorem 1 are pairwise incomparable. Therefore, such an assignment yields a directed cut cover for all edge directions and thus a general bound on the directed cut cover number.

 \triangleright Corollary 2. For every directed graph G, the directed cut cover number is bounded by

$$\vec{c}(G) \leq \lceil \log_2 \chi(G) + \frac{1}{2} \log_2 \log_2 \chi(G) + 1 \rceil.$$

In fact, the bound in Corollary 2 is best possible for general directed graphs, because a cut cover of the complete bidirected graph corresponds to an assignment of pairwise incomparable vectors (and Sperner's theorem asserts that the used set of vectors is maximal).

Figure 3 illustrates an example of a graph G and an ordering $<_L$ showing that the bound of Theorem 1 and Corollary 2 is also tight for some (directed acyclic) graphs with $\chi(G) = 3$. In the following, we show a general lower bound for our more special setting.

▶ **Lemma 1.** For every C, there exists a graph G and an ordering $<_L$ such that $\chi(G) > C$ and the number N of steps in every scan cover of $(G, <_L)$ is at least

$$N \ge \lceil \log_2 \chi(G) + \frac{1}{4} \log_2 \log_2 \chi(G) \rceil.$$

Proof. Let $\ell \geq 4$ be an integer divisible by 4 and $n := 2^{\ell}$ such that $2^n > C$. We consider the Turan graph G on $n2^n$ vertices partitioned into 2^n independent sets of size n. Because G is a complete 2^n -partite graph, it holds that $\chi(G) = 2^n$. We place the vertices on the line, such that for a fixed $\{1, \ldots, 2^n\}$ -coloring of G, there exist n disjoint intervals in which the colors appear in the order $1, \ldots, 2^n$. For an illustration consider Figure 4.

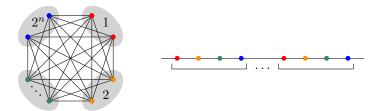


Figure 4 Illustration of G and the ordering $<_L$ of the vertices on L for n=2 ($\ell=1$).

For a contradiction, suppose that there exists a scan cover $s: V \to \{0,1\}^k$ of $(G, <_L)$ with $k := \lceil \log_2 \chi(G) + \frac{1}{4} \log_2 \log_2 \chi(G) \rceil - 1 = n + \frac{\ell}{4} - 1$ steps. Thus, the number of different vectors is $2^k = 2^{n-1} n^{1/4}$.

Let t denote the number of different color classes in which some vector is used at least $n^{3/4}$ times. We show that $t \geq \frac{1}{2}2^n$. Clearly, each vector may only appear in one color class, i.e., the color classes induce a partition of the set of vectors. Consider the 2^n-t color classes (and their assigned vectors) in which no vector is used $n^{3/4}$ times. Let δ denote the average usage of vectors in these classes. Note that δ is lower bounded by the ratio of the number of vertices, namely $(2^n-t)n$, and the maximum number of remaining vectors, namely 2^k-t . Consequently, $\delta \geq \frac{n2^n-tn}{2^k-t}$. Moreover, $\delta < n^{3/4}$, because otherwise there exists a further color class for which some vector appears at least $n^{3/4}$ times. Therefore, we obtain the following chain of implications:

$$\delta < n^{3/4} \implies \frac{n2^n - tn}{2^k - t} < n^{3/4} \iff t > 2^n \cdot \frac{1}{2(1 - n^{-1/4})} \implies t > \frac{1}{2}2^n$$

For each of these t color classes, we choose a vector with a maximal number of appearances and introduce an interval on L from the first to the last occurrence. By the ordering of the vertices, every two vertices of the same color have a distance of at least 2^n , and hence the interval spans at least $d = 2^n n^{3/4}$ vertices. On average, every vertex is contained in the following number of intervals

$$\frac{t \cdot d}{|V|} \ge \frac{\frac{1}{2}2^n \cdot 2^n n^{3/4}}{n2^n} = \frac{2^n}{2n^{1/4}} = 2^{n-1} n^{-1/4}.$$

By the pigeonhole principle, there exists a set S of at least $2^{n-1}n^{-1/4}$ vectors with mutually intersecting intervals. We claim that any two vectors a and b of S are pairwise *incomparable*, i.e., there exist two indices i, j such that $a_i = 0, b_i = 1$ and $a_j = 1, b_j = 0$: Because the intervals intersect, among the four occurrences of a and b on $<_L$, there exist three such that they appear alternating. To scan the corresponding edges, the vectors must be incomparable. Thus, there must exist $2^{n-1}n^{-1/4}$ pairwise incomparable vectors.

However, by Sperner's theorem, every set of vectors of length k contains at most $\binom{k}{\lfloor k/2 \rfloor}$ pairwise incomparable vectors and

$$\binom{k}{\lfloor k/2 \rfloor} \leq \sqrt{\frac{2}{k\pi}} 2^k (1 + \frac{1}{11}) \leq 2^k \frac{1}{\sqrt{k}}.$$

It remains to show that the number of necessary incomparable vectors exceeds this:

$$2^k \cdot \frac{1}{\sqrt{k}} < \frac{2^n}{2n^{1/4}} \iff n < k$$

This holds for $\ell > 4$ and yields a contradiction. For $\ell = 4$ it holds that k = n. Thus, each color class has a unique vector, all of which need to be incomparable, a contradiction.

2.2 No constant-factor approximation in 1D

Theorem 1 implies the following.

▶ **Lemma 2.** A C-approximation algorithm for MSC implies a polynomial-time algorithm for computing a coloring of graph G, $k := \chi(G)$, with $4^C \cdot k^C \cdot \sqrt{\log_2(k)}^C$ colors.

Proof. Let ℓ^* denote the length of a minimum scan cover of G. Then a C-approximation algorithm computes a scan cover of length $\ell \leq C \cdot \ell^*$. Theorem 1 implies that $C \cdot \ell^* \leq C \cdot \lceil \log_2 k + \frac{1}{2} \log_2 \log_2 k + 1 \rceil$, yielding a coloring with 2^{ℓ} colors. Thus,

$$2^{\ell} \le 2^{C(\lceil \log_2 k + \frac{1}{2} \log_2 \log_2 k + 1 \rceil)} \le 2^{C \cdot \log_2 k} \cdot 2^{\frac{1}{2} \cdot C \cdot \log_2 \log_2 k} \cdot 2^{2C} \le 4^C \cdot k^C \cdot \sqrt{\log_2(k)}^C.$$

▶ Theorem 3. Even in 1D, a C-approximation for MSC for any $C \ge 1$ implies P = NP.

Proof. Suppose there is a C-approximation for some constant C>1. By Lemma 2, a C-approximation of MSC in 1D implies that there is a polynomial-time algorithm for finding for every k-colorable graph G a coloring with $4^C \cdot k^C \cdot \sqrt{\log_2(k)}^C$ colors. Khot [19] showed that, for sufficiently large k, it is NP-hard to color a k-colorable graph with at most $k^{\log_2(k)/25}$ colors. However, for every C we can find a k such that $4^C \cdot k^C \cdot \sqrt{\log_2(k)}^C < k^{\log_2(k)/25}$. This yields a polynomial-time algorithm for an NP-hard problem, implying that P = NP.

2.3 Polynomially solvable cases

Even though there is no constant-factor approximation in general, we would like to note that bipartite and complete graphs in 1D can be solved in polynomial time.

ightharpoonup Observation 3. For instances of MSC in 1D for which the underlying graph G is bipartite, there exists a polynomial-time algorithm for computing an optimal scan cover.

Proof. We assume that $\chi(G) = 2$, otherwise there is no edge to scan. If for every vertex, all its neighbors lie either before or after it, G can be scanned within one step, which is clearly optimal. Otherwise, every scan cover needs at least two steps. By Theorem 1, there exists a scan cover with 2 steps. Because bipartite graphs can be colored in polynomial time, the proof of Theorem 1 provides a scan cover.

▶ **Observation 4.** For instances of MSC in 1D for which the underlying graph G is a complete graph, there exists a polynomial-time algorithm for computing an optimal scan cover.

Proof. Because every scan cover induces a cut cover and $c(G) = \lceil \log_2 n \rceil$, it suffices to provide a scan cover with this number of steps. To this end, we recursively scan the bipartite graphs induced by two vertex sets when split into halves with respect to $<_L$.

3 Two-dimensional point sets

For two-dimensional point sets, we show that even for bipartite graphs, it is hard to approximate MSC better than 3/2. Conversely, we present a 9/2-approximation algorithm for these graphs and apply the gained insights to achieve approximations for k-colorable graphs.

3.1 Bipartite graphs

By Theorem 3, we cannot hope for a constant-factor approximation for general graphs. However, bipartite graphs in 1D can be solved in polynomial time. We show that the added geometry of 2D makes the MSC hard to approximate even for bipartite graphs.

3.1.1 No approximation better than 1.5 for bipartite graphs in 2D

As a stepping stone for the geometric case, we establish the following.

▶ **Lemma 5.** It is NP-hard to approximate A-MSC better than 3/2 even for bipartite graphs.

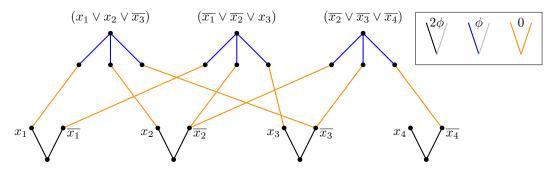


Figure 5 Illustration of the graph G_I for the instance $I = (x_1 \lor x_2 \lor \overline{x_3}) \land (\overline{x_1} \lor \overline{x_2} \lor x_3) \land (\overline{x_1} \lor \overline{x_2} \lor \overline{x_3})$.

Proof sketch. The proof is based on a reduction from the problem Not-All-Equal-3-Sat, for which a satisfying assignment fulfills the property that each clause has a true and a false literal. For every instance I of Not-All-Equal-3-Sat, we construct a graph G_I and a cost function α , such that there exists a scan cover with a scan time of 2ϕ only if I is a satisfiable instance. Otherwise, every scan cover has at least a value of 3ϕ .

The graph G_I , illustrated in Figure 5, is a special variant of a clause-variable-incidence graph and has (blue) clause, (black) variable, and (orange) incidence edges. The transition cost for any edge pair is ϕ if it contains a clause edge, 2ϕ if it contains a variable edge, and 0 otherwise. An example is depicted in Figure 6. For full details, see the long version [15].

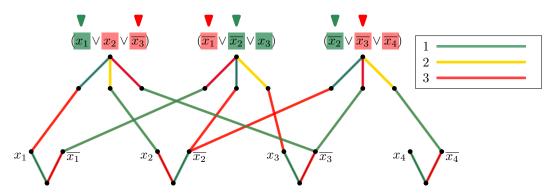


Figure 6 Illustration of a scan cover of the graph G_I . Green edges are scanned in the first, yellow in the second, and red edges in the third step.

We now use Lemma 5 for showing hardness of bipartite graphs in the geometric version.

▶ **Theorem 4.** Even for bipartite graphs in 2D, a C-approximation for MSC for any C < 3/2 implies P = NP.

Proof sketch. Suppose that there is a $(3/2 - \varepsilon)$ -approximation for some $\varepsilon > 0$. For every instance I of Not-All-Equal-3-Sat, we can construct a graph G_I for MSC in 2D such that it has a scan time of 240° if I is satisfiable, and a scan time of at least $360^{\circ} - \varepsilon$ otherwise. We essentially use the same reduction as in the proof of Lemma 5. The idea is to embed the constructed graph G_I in the plane on a triangular grid such that the transition costs are reflected by the angle differences. Figure 7 illustrates the gadgets.

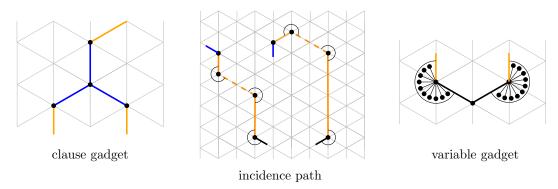


Figure 7 Embedding the graph G_I into the plane by using $\phi = 120^{\circ}$. Additional leaves are added to force the usage of the larger angle of 240° .

The clause and variable gadgets are connected by paths instead of edges (solid and dashed orange edges). In order to enforce angles of 240° , we insert additional edges and vertices into the 240° angle with an angle difference of ε . If an incident vertex uses the shorter angle of 120° , it still needs to cover the additional edges resulting in an overall turning angle of at least $360^{\circ} - \varepsilon = 3\phi - \varepsilon$. For full details, see the long version [15].

3.1.2 4.5-approximation for bipartite graphs in 2D

Conversely, we give absolute and relative performance guarantees for bipartite graphs in 2D.

▶ **Theorem 5.** Let I = (P, E) be a bipartite instance of MSC with vertex classes $P = P_1 \cup P_2$. Then I has a scan cover of time 360° . Moreover, if P_1 and P_2 are separated by a line, there is a scan cover of time 180° .

Proof. We show that the following strategy yields a scan cover of time 360° : All points turn in clockwise direction, with the points in P_1 starting with heading north and the points in P_2 with heading south; see Figure 8a for an example. Note that the connecting line between any point $p_1 \in P_1$ and any point $p_2 \in P_2$ forms alternate angles with the parallel vertical lines through p_1 and p_2 , so both face each other when reaching this angle during their rotation; see Figure 8b. In the case of separated point sets, a rotation of 180° suffices to sweep the other set, as illustrated in Figure 8c.

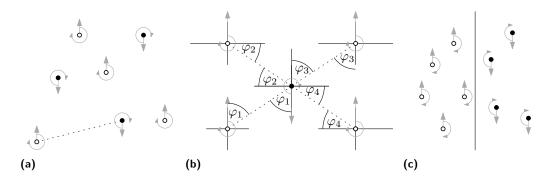


Figure 8 (a) The vertices in P_1 and P_2 rotate clockwise and start by heading north and south, respectively. (b) Due to alternate angles, vertices of different parts of the vertex partition face each other at the same time. (c) When P_1 and P_2 are separated by a line, a scan time of 180° suffices.

Theorem 5 yields an *absolute* bound for bipartite graphs. Now we give a constant-factor approximation even for small optimal values.

▶ **Theorem 6.** There is a 4.5-approximation algorithm for MSC for bipartite graphs in 2D.

Proof. Consider an instance I of MSC in 2D and let Λ denote the minimum angle such that for every vertex some Λ -cone contains all its edges. Clearly, Λ is a lower bound on the value OPT of a minimum scan cover of I. We use one of two strategies depending on Λ .

If $\Lambda \ge 90^{\circ}$, we use the strategy of Theorem 5 which yields a scan cover of at most 360° and hence a 4-approximation.

If $\Lambda < 90^\circ$, we use an adaptive strategy as follows. For each vertex, we partition the set of headings $[0,360^\circ)$ into 2s sectors of size $\Lambda' = {}^{360^\circ}/2s$, see Figure 9a. We choose s maximal (and, thus, Λ' minimal) such that $\Lambda' \geq \Lambda$. This implies that the edges of every vertex are contained in at most two adjacent sectors, see Figure 9a. Note also that $\Lambda' < {}^{3}/2\Lambda$, because $\Lambda > {}^{360^\circ}/2(s+1)$ and $s \geq 2$.

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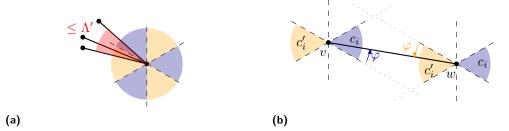


Figure 9 (a) Dividing the headings into 2s sectors with angle $\Lambda' = {}^{360^{\circ}}/2s$ by inserting s lines. For every vertex, the incident edges lie in at most two adjacent sectors of size Λ' , because $\Lambda \leq \Lambda'$. (b) An edge e = vw that lies in c_i for v, lies in $c_i' = c_{i+s}$ for w. If v scans c_1 and w scans c_1' (both counterclockwise), they scan e at the same time φ due to the alternate angles in the parallelogram.

Let the sectors be $c_i = [(i \cdot \Lambda', (i+1) \cdot \Lambda'), \text{ for } i = 0, \dots, 2s-1.$ Moreover, $c_i' := c_{i+s \mod 2s}$ is the sector *opposite* of c_i . Note that an edge e = vw is in the sector c_i of v if and only if e is in the opposite sector c_i' of w, see Figure 9b. Let C_{even} be the set of sectors with even indices, C_{odd} the one with odd indices, and C'_{even} and C'_{odd} the set of opposite sectors, respectively. Because the incident edges of each vertex are contained in at most two adjacent sectors, every vertex has edges in (at most) one sector of C_{even} and one sector of C_{odd} .

This allows the following strategy. Denote the bipartition of the vertex set by $P = P_1 \cup P_2$. In the first phase, the vertices in P_1 scan the sector with edges in C_{even} in clockwise direction, while the vertices in P_2 scan the sector in C'_{even} . In the second phase, vertices in P_1 scan the sector in C_{odd} in counterclockwise direction, while the vertices in P_2 scan the sector in C'_{odd} .

As in Theorem 5, every edge is scanned in the first or second scan phase due to the alternate angles. Clearly, each scan phase needs Λ' . Between the two scan phases, every vertex v needs to turn to change its heading from the end heading of the first scan phase to the start heading of the second. Because both sectors of v are incident and due to the reversed direction, the turning angle is at most Λ' ; in particular, either the end heading of the first sector is contained in the boundary of the second sector or the two start headings of both phases coincide. Figure 10 depicts an example scan cover. The resulting scan time is $3\Lambda' \leq 3 \cdot {}^{3}/2\Lambda \leq 4.5 \cdot \text{OPT}$.

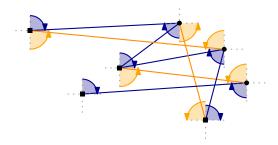


Figure 10 An example with $\Lambda' = 90^{\circ}$. P_1 and P_2 are indicated by squares and circles, respectively. The blue sectors are scanned in the first scan phase; the orange sectors in the second. Each scan phase and the turning phase costs Λ' .

3.2 Graphs with bounded chromatic number

Like in 1D, the value of a minimum scan cover in 2D has a strong relation to the chromatic number. More specifically, we show that the optimal scan time lies in $\Theta(\log_2 \chi(G))$ and that for a given coloring of the graph G with $\chi(G)^c$ colors, we can provide an O(c)-approximation.

▶ Lemma 6. Let I = (P, E) be an instance of MSC in \mathbb{R}^d , d > 1. If I has a scan cover of length T > 0, then G has a cut cover of size $d \cdot \lceil \frac{T}{90^{\circ}} \rceil$, i.e., $c(G) \leq d \cdot \lceil \frac{T}{90^{\circ}} \rceil$.

Proof. Partition the scan cover into $\lceil \frac{T}{90^{\circ}} \rceil$ intervals of length at most 90°. For each interval i, we consider the set of edges that are scanned within this interval, inducing a graph G_i . We show that each G_i is 2^d -partite. Because $c(G_i) = \lceil \log_2(\chi(G_i)) \rceil \leq d$, this implies the claim.

We first consider the case d=2. We classify the points of P into four sets, depending on their turning behavior within the interval i. Each point has a quadrant $[0,90^{\circ})$, $[90^{\circ},180^{\circ})$, $[180^{\circ},270^{\circ})$, or $[270^{\circ},360^{\circ})$ to which it is heading at the time 45° ; we assign each point this quadrant. Note that every point can only leave its assigned quadrant by less than $\pm 45^{\circ}$. Two points that are assigned to the same quadrant are independent in G_i : When their edge is scanned, the headings of the two points have to be opposite, i.e., they differ by exactly 180° . Thus, the only case in which two point headings could differ by 180° is if one leaves its quadrant by 45° in clockwise and the other by 45° in counterclockwise direction. However, in this case, the points would not have been assigned to the same half-open sector. For an illustration consider Figure 11.

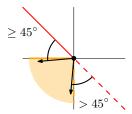


Figure 11 Every vertex is assigned to the (orange) sector to which it is heading at time 45°. The boundary of the reachable headings within 90° is shown in red. Since the sector is half-open, two vertices assigned to the same sector cannot reach opposing headings and thus cannot scan their edge.

For $d \geq 3$, the idea is analogous. To simplify the argument we choose a coordinate system, i.e., an orthonormal basis (ONB), such that, at time 45°, no point heads in a direction that lies on a lower-dimensional subspace spanned by the basis vectors. Let B denote the set of all potential basis vectors in \mathbb{R}^d , i.e., $B = \mathbb{R}^d$. For every point, we delete the line spanned by its heading h at time 45° and the (d-1)-dimensional subspace orthogonal to h from B. The remaining set B' is a d-dimensional space minus a finite number of lower-dimensional subspaces. It follows by induction that B' contains an ONB.

The points of P are partitioned into 2^d different sets, depending on the orthant in which they are contained at time 45° . Note that if two point headings of the same orthant differ by 180° , their angle difference at time 45° is 90° , i.e., they lie on a lower dimensional subspace spanned by the basis vectors. This is a contradiction to the choice of the ONB.

Because $c(G) = \lceil \log_2 \chi(G) \rceil$, Lemma 6 has the following implication.

▶ Lemma 7. Every instance I of MSC in \mathbb{R}^d needs a scan time T of at least $\Omega(\log_2 \chi(G_I))$, with G_I denoting the underlying graph of I. More precisely, $T \geq \frac{\lceil \log_2 \chi(G) \rceil - d}{d} \cdot 90^\circ$.

Proof. Because $c(G) = \lceil \log_2 \chi(G) \rceil$, Lemma 6 implies that $\lceil \log_2 \chi(G) \rceil \leq d \lceil \frac{T}{90^\circ} \rceil$. In particular, it holds that $\lceil \log_2 \chi(G) \rceil \leq d \frac{T}{90^\circ} + d \iff \frac{\lceil \log_2 \chi(G) \rceil - d}{d} \cdot 90^\circ \leq T$.

These insights have the following implications.

▶ **Theorem 7.** For instances of MSC in 2D with a k-coloring of the graph G = (V, E), such that $k \leq \chi(G)^c$ for some function c, there is an O(c)-approximation.

Proof. Partition G into $\lceil \log_2 k \rceil$ bipartite graphs G_i . By Theorem 6, each G_i can be scanned in time $\beta \cdot OPT_i$, with $\beta = 4.5$ and OPT_i denoting the optimum of the instance induced by G_i . Clearly, $OPT_i \leq OPT$, and turning from the last scan of one bipartite graph to the next takes at most a time of OPT. Hence, this scan cover needs a time of at most $(\beta + 1)OPT\lceil \log_2 k \rceil$.

If $\chi(G) \leq 4$, then $O(\lceil \log_2 k \rceil) \leq O(\lceil c \cdot \log_2(\chi(G)) \rceil) \leq O(\lceil c \cdot \log_2(4) \rceil) \leq O(\lceil 2c \rceil) \in O(c)$. If $\chi(G) \geq 5$, then Lemma 7 ensures that $OPT \geq \Omega(\log_2(\chi(G))) > 0$. Therefore, the performance guarantee is in $O\left(\frac{\log_2 k}{\log_2(\chi(G))}\right) = O\left(\frac{c \log_2(\chi(G))}{\log_2(\chi(G))}\right) = O(c)$.

As a direct implication of Theorem 7, we get a spectrum of approximation algorithms for interesting special cases.

- ▶ Corollary 8. MSC in 2D allows the following approximation factors.
- 1. $O(\log_2 n)$ for all graphs. Furthermore, the minimum scan time lies in $\Theta(\log_2 \chi(G))$.
- **2.** O(1) for planar graphs.
- **3.** $O(\log_2 d)$ for d-degenerate graphs.
- **4.** O(1) for graphs of bounded treewidth.
- **5.** O(1) for complete graphs.

The following bound shows a refined approximation for complete graphs.

▶ Corollary 9. Consider the MSC for complete graphs with n vertices in 2D. There is a c-approximation algorithm with $c \to 6$ for $n \to \infty$.

Proof. We may assume without loss of generality that n > 4. By Lemma 7, the minimum scan time is at least $(\lceil \log_2(n) \rceil - 2) \cdot 45^{\circ} > 0$. For the upper bound, we partition the point set recursively into $\lceil \log_2(n) \rceil$ bipartite graphs by lines (alternating horizontal and vertical). Hence, Theorem 5 allows us to scan each bipartite graph within 180°. The transition between two scan phases is at most 90°. Therefore, the scan time is upper bounded by $\lceil \log_2(n) \rceil 180^{\circ} + (\lceil \log_2(n) \rceil - 1)90^{\circ}$. This yields a performance guarantee of

$$\frac{270^{\circ}(\lceil \log_2(n) \rceil - 2) + 450^{\circ}}{45^{\circ}(\lceil \log_2(n) \rceil - 2)} = 6 + \frac{10}{(\lceil \log_2(n) \rceil - 2)}.$$

The factor in Corollary 9 is $c \le 8$ when $n \ge 2^7$ and $c \le 7$ when $n \ge 2^{12}$.

4 Three-dimensional point sets and abstract MSC

In the following, we observe that A-MSC generalizes the Path-TSP.

▶ Observation 8. Let G = (V, E) be a star on n + 1 vertices with center v and α a metric transition cost function on $E \times E$. Then, an A-MSC of (G, α) corresponds to a TSP-path of the complete graph on $V \setminus \{v\}$ with metric cost $c(u_1, u_2) = \alpha(vu_1, vu_2)$ and vice versa.

Observation 8 has two immediate consequences. Firstly, because the metric Path-TSP is NP-hard, it follows that

▶ **Observation 9.** A-MSC is NP-hard even for stars.

Secondly, the 1.5-approximation for metric Path-TSP by Zenklusen [27] can be applied.

▶ **Observation 10.** There exists a 1.5-approximation algorithm for A-MSC for stars.

In contrast to 1D and 2D, we show that the chromatic number does not provide an upper bound for MSC in 3D and A-MSC.

▶ **Observation 11.** There are instances of MSC in 3D with $\chi(G) = 2$ that need at least $\Omega(\sqrt{n})$. There are instances of MSC in nD with $\chi(G) = 2$ that need at least $\Omega(n)$.

Proof. For the first claim consider a geodesic triangular grid on a sphere and embed a star graph such that its leaves are grid points and the center of the star lies in the center of the sphere. The $\Omega(\sqrt{n})$ can be achieved by increasing the resolution of the grid by subdivision, see Figure 12: While the minimum turn cost between two consecutive edges approximately halves, the number of vertices roughly quadruples, doubling the overall costs that is lower bounded by $(n-1) \cdot l$ if l is the minimum edge length.

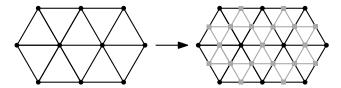


Figure 12 The geodesic grid is refined by subdividing the edges. Because a triangulation with n vertices has 3n-6 edges, subdividing roughly quadruples the number of vertices.

The second claim follows from considering a star on n vertices for which each leaf is placed on a different coordinate axis. Therefore, the turn cost between any two edges is 90° and it takes $90^{\circ}n$ to scan the graph.

The approximation technique for bipartite graphs in 2D relies on alternate angles and fails for 3D or A-MSC. Nevertheless, we provide a 2.5-approximation for trees.

▶ **Theorem 10.** There exists a 2.5-approximation algorithm for A-MSC for trees.

Proof. Let $I = (G, \alpha)$ be an instance of A-MSC for which G is a tree, and let OPT be the minimum scan time of I. For every vertex v, we approximate an ordering of minimum cost over all its incident edges E_v . Let N(v) denote the set of neighbors of v. By Observation 8 such an ordering corresponds to a TSP-path. Consequently, we may use the 1.5-approximation algorithm for metric Path-TSP by Zenklusen [27]. Moreover, we enhance the edge ordering to a cyclic ordering by inserting an edge from the last to the first edge; because the cost function is metric, the cost of the additional edge is upper bounded by the minimum cost ordering of the incident edges. Therefore, the scan time ℓ_v of the computed cyclic edge ordering of v is at most $\ell_v \leq (1.5+1)OPT$.

We construct a scan cover as follows: Every vertex follows its cyclic edge ordering. The start headings of the vertices are chosen such that the scan time of each edge e = uv is synchronized at the vertices u and v. To this end, we choose some vertex r as the root and denote the parent of each vertex v by par(v) in the tree G with respect to the root r. We scan the edges of r according to the cyclic edge orderings by starting with any heading, see also Figure 13. We then determine the start headings by a tree traversal (e.g., DFS or BFS): Let v be a vertex whose start heading has to be determined, and assume the start heading of u := par(v) is already fixed. When uv is scanned at time t for u, then the cyclic ordering of E_v is shifted, so that v sees uv also at time t. If this time lies between two scans,

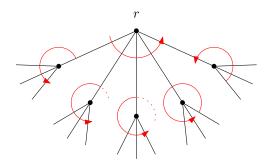


Figure 13 Root r can choose its schedule. The (cyclic) schedules of the children are synchronized with the timing of its parent. Because the graph is a tree, there are no cyclic dependencies.

we simply start at the next incident edge and let the vertex wait for the appropriate time. Because all vertices start at the same time, the resulting scan cover has a scan time of at most $\max_{v} \ell_v \leq 2.5 \cdot OPT$.

Theorem 10 allows an approximation algorithm in terms of the arboricity of the underlying graph. Recall that the *arboricity* of a graph denotes the minimum number of forests into which its edges can be partitioned.

▶ **Theorem 11.** There is a 3.5A-approximation for the A-MSC for graphs of arboricity A.

Proof. We compute a decomposition into A forests in polynomial time [17]. To obtain a scan cover we use the approximation algorithm of Theorem 10 for each forest and concatenate the resulting scan covers in any order. Because the transition cost between any two forests is upper bounded by the minimum scan time OPT, the resulting scan cover has time of at most $(2.5+1)OPT \cdot A$. Consequently, we obtain a 3.5A-approximation.

5 Conclusion and open problems

We have presented several algorithmic results for the abstract and geometric version of the minimum scan cover problem with a metric angular cost function, which has strong connections to the chromatic number.

There is a spectrum of interesting directions for future work. How can we make use of methods for solving graph coloring problems to compute practical solutions to real-world instances? In many scenarios, this will involve considering satellites on different trajectories, in the presence of a large obstacle: the earth. This gives rise to a variety of generalizations, such as the presence of time windows for possible communication. Other variations of both practical and theoretical interest arise from considering objective functions such as minimizing the total energy of all satellites or minimizing the maximum energy per satellite.

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