

On Cyclic Solutions to the Min-Max Latency Multi-Robot Patrolling Problem

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Wang, Hao-Tsung Yang

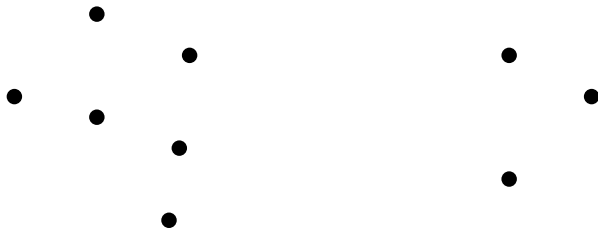
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June 2023

Robot patrolling problem

k robots with maximum unit speed collectively patrol n sites in a metric space.

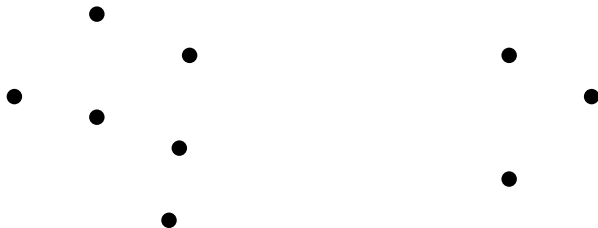
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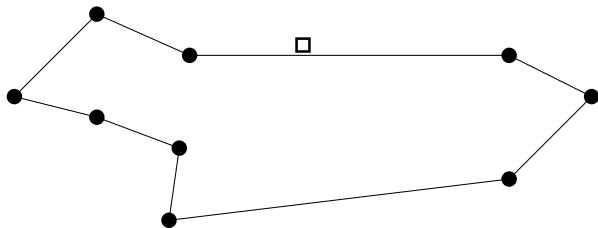


Patrol schedules are infinite sequences.

Goal: minimize the **maximum time duration (latency)** between consecutive visits to any site.

Robot patrolling problem

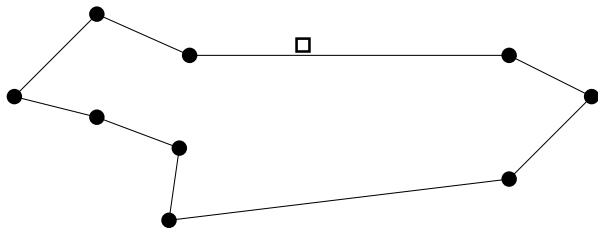
$k = 1$: travelling salesman problem. NP-hard.



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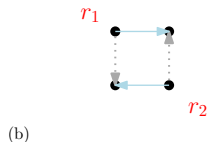
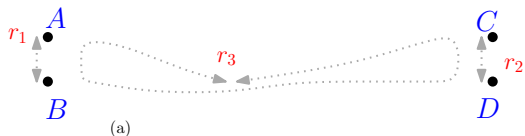
- General metric setting: $3/2$ -approximation (Christofides'76), $3/2 - \delta$, $\delta > 10^{-36}$ (Karlin, Klein, Gharan'21).
- Euclidean setting: $(1 + \epsilon)$ -approximation (Arora'98, Mitchell'99).

Challenges

$k \geq 2$: there can be optimal solutions that are chaotic.

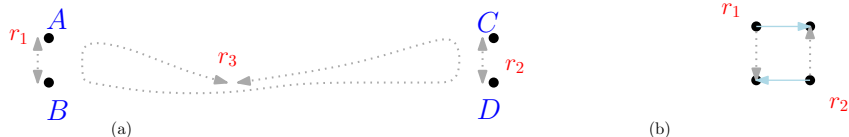
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Not clear if the problem (whether $\text{opt latency} < L$) is decidable if distances are not integers.

What about approximations?

[ABBGLNRSWY'20] If there is an α -approximation to

- k -path cover problem: find k **paths** to cover n sites with min max path length.
- min-max k -tree cover problem: find k **trees** to cover n sites with min max tree weight.
- min-max k -cycle cover problem: find k **cycles** to cover n sites with min max cycle length.

there is a 2α -approximation to k -robot patrol problem.

What about approximations?

- k -path cover problem: 4 [Arkin, Hassin, Levin'06]
- min-max k -tree cover problem: $8/3$ [Xu, Liang, Lin'13]
- min-max k -cycle cover problem: $16/3$ [Xu, Liang, Lin'13]

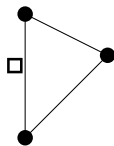
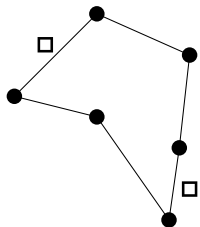
Best known approximation to k -robot patrol: $16/3$.

Cyclic solutions

We focus on **cyclic** solutions:

- n sites partitioned into $\ell \leq k$ groups P_1, P_2, \dots, P_ℓ .
- Group P_i is allocated one or more robots, evenly spread along $TSP(P_i)$.

□ □ □ k



Main Results

1. An **optimal cyclic** solution is a $2(1 - 1/k)$ approximation to the optimal overall solution.

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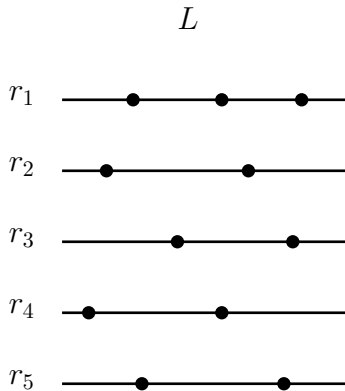
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 - an extra $1 + \epsilon$ approximation factor.
 - an extra $O((k/\epsilon)^k)$ factor in running time.
3. Solving multi-robot patrol problem:
 - General metric setting: $3 - 3/k + \epsilon$ approximation.
 - Euclidean setting: $2 - 2/k + \epsilon$ approximation.

Outline

- Robot patrolling problem
- **Cyclic solutions**
- Find a $(1 + \varepsilon)$ -approximate cyclic solution
- Open problems

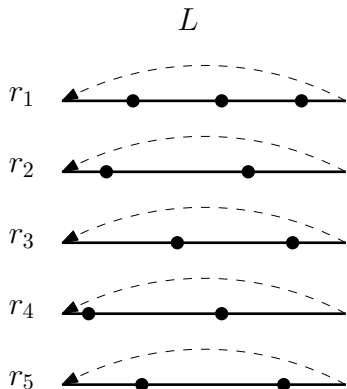
Periodic schedule w/ 2-approximation

Take an OPT solution w/ latency = L . All n sites must be visited during a time window L .



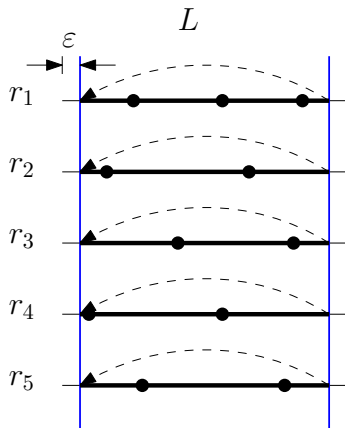
Periodic schedule w/ 2-approximation

Take an OPT solution w/ latency = L . All n sites must be visited during the time window L . \Rightarrow Wrap around, we get a solution with latency $\leq 2L$.



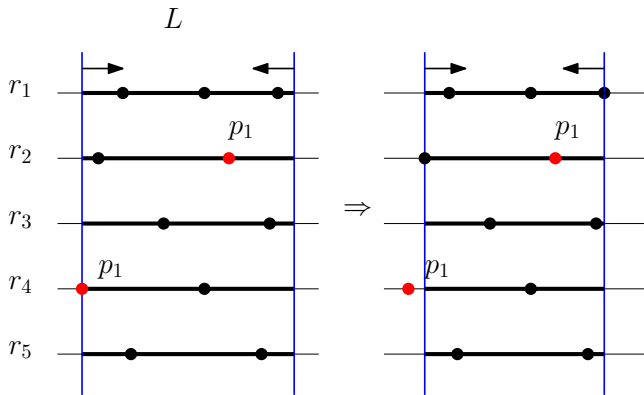
Improve 2-approximation?

If we can shrink the window by ε on both sides yet still cover all sites, we get latency $\leq 2(1 - 2\varepsilon) \cdot L$.



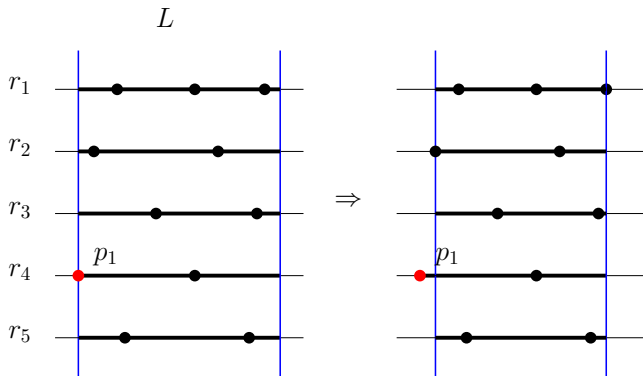
Shrinking process

Sweep from both ends inward, until we meet a site (say p_1).
If p_1 is still covered, ignore & keep going.



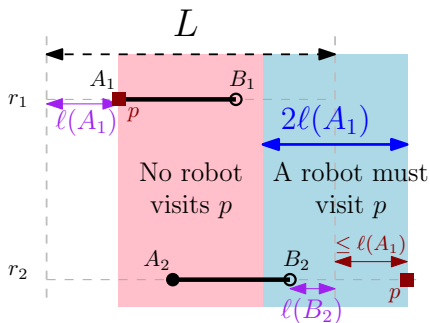
Shrinking process

Sweep from both ends inward, until we meet a site (say p_1).
If p_1 is "critical", freeze the endpoint of r_4 at p_1 .



After shrinking process

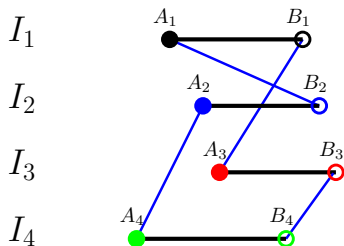
Frozen segments: left endpoints A , right endpoints B .
Robot r_1 at A_1 visits site p with **sweep distance** $\ell(A_1)$.



Shortcut: r_2 moves from B_2 to visit $f_1(A_1)$, pay cost $\leq \ell(A_1) + \ell(B_2)$.

How to use the shortcut edges? An easy case

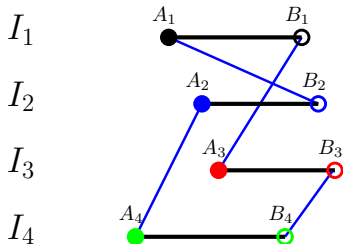
Add a **matching** of shortcut edges to the frozen segments \Rightarrow a set of bichromatic cycles \Rightarrow a cyclic solution.



No increase in latency: cost paid no greater than saving.

How to use the shortcut edges? An easy case

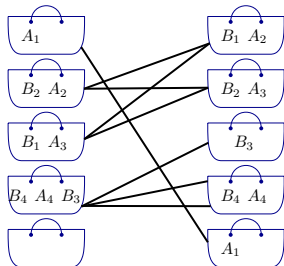
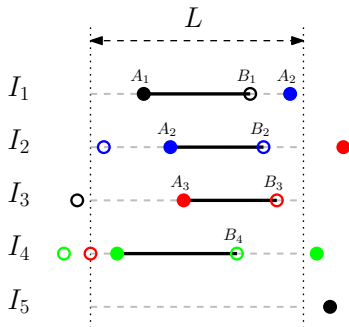
Add a **matching** of shortcut edges to the frozen segments \Rightarrow a set of bichromatic cycles \Rightarrow a cyclic solution.



No increase in latency: cost paid no greater than saving.
But, can we find a matching of shortcut edges?

Shortcut graph and bag graph

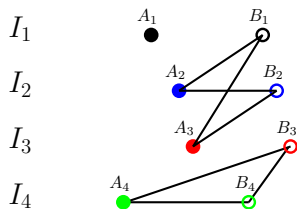
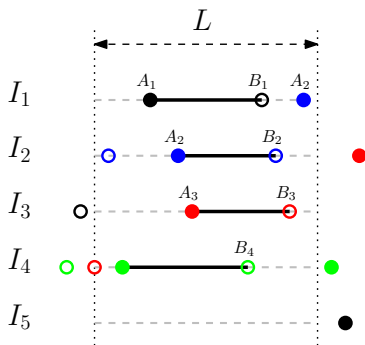
Bag graph: capture potential shortcuts.



Place an edge between two bags if they share a common endpoint label.

Shortcut graph and bag graph

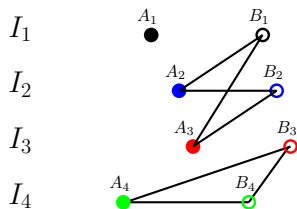
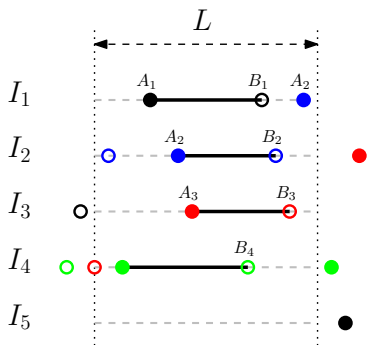
Shortcut graph: connect endpoints with potential shortcuts.



Shortcut graph is isomorphic to the [line graph](#) of the bag graph.

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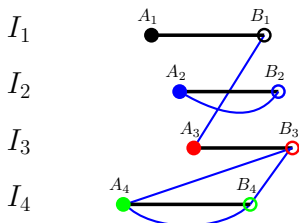
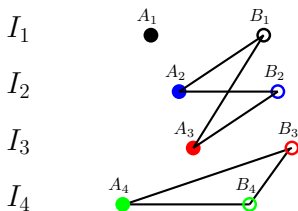


Shortcut graph is isomorphic to the [line graph](#) of the bag graph. [Sumner'74] The line graph of a [connected](#) graph with an [even](#) number of edges has a perfect matching.

Modify into a cyclic solution: Add shortcuts

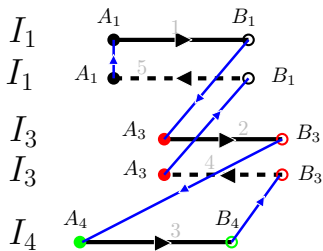
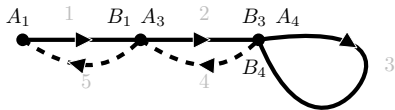
Case study on connected components of the bag graph:

- even # vertices \Rightarrow a perfect matching.
- odd # vertices, no empty segment \Rightarrow a matching + a triangle.
- odd # vertices, w/ empty segment \Rightarrow a matching + a vertex.



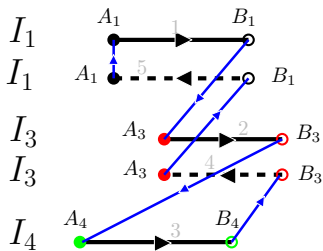
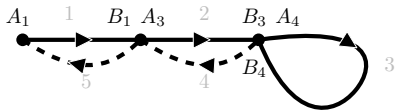
Modify into a cyclic solution: Eulerize

Duplicate certain frozen edges to make the graph Eulerian.



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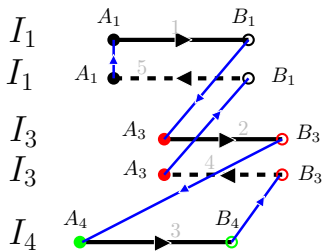
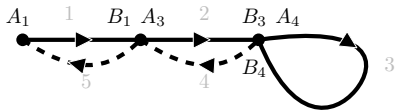
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Issue: pay extra cost for duplicated black edges.

Modify into a cyclic solution: Eulerize

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Analyze # duplicated edges & # “useless” robots.

Max latency $\leq 2(1 - 1/k)L$.

Outline

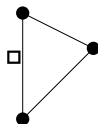
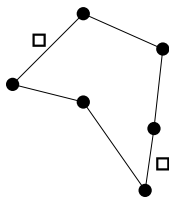
- Robot patrolling problem
- Cyclic solutions
- **Find a $(1 + \epsilon)$ -approximate cyclic solution**
- Open problems

An optimal cyclic solution

An optimal cyclic solution:

- Partitioning the sites into clusters $\Pi = \{P_1, P_2, \dots, P_t\}$, $t \leq k$.
- Assign k robots to these clusters: $k_1 + k_2 + \dots + k_t = k$.
- For each cluster, we place robots evenly along $TSP(P_i)$.

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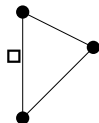
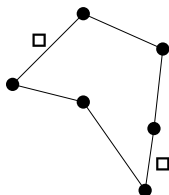


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Issue 1: how to find the partition Π ?

Issue 2: how to assign robots to a partition Π ?

How to assign robots to a partition?

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A 'well-separated' $(1 + \varepsilon)$ -approximate cyclic solution

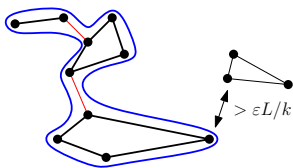
OPT cyclic solution has latency L .

- There exists a $(1 + \varepsilon)$ -approximate cyclic solution with a partition Π s.t. the min distance between clusters is $\geq \varepsilon L/k$.

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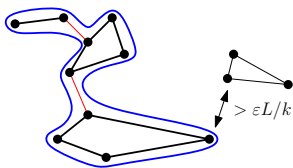
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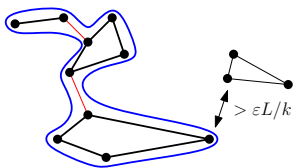


Add all **short** edges to an opt cyclic solution.

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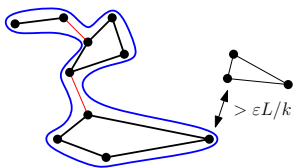
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For each component keep the “**minimum spanning**” edges.

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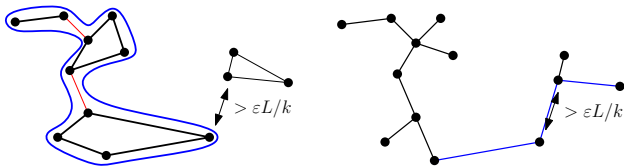
For each component keep the “**minimum spanning**” edges.

Turn each connected component to a **new cycle**.

Find a $(1 + \varepsilon)$ -approximate cyclic solution?

Start with the MST T .

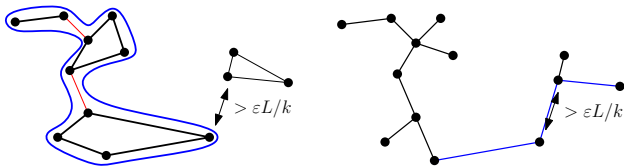
- MST has $\leq k(1 + k/\varepsilon)$ long edges ($\geq \varepsilon L/k$).
- Enumerate a subset of at most k long edges to remove.



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Extra factor of $O((k/\varepsilon)^k)$ time to find the correct partition.

Open problems

- Improve approximation factor of $2(1 - 1/k)$ by the optimal cyclic solution.

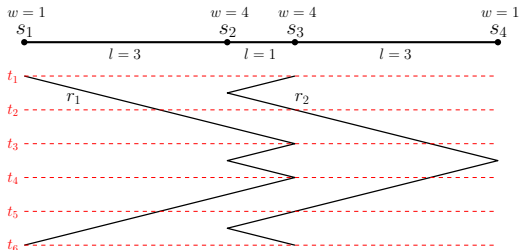
Open problems

- Improve approximation factor of $2(1 - 1/k)$ by the optimal cyclic solution.
- Conjecture: the optimal cyclic solution is overall optimal.

More open problems

Weighted version: minimize $\max_i w_i L_i$.

- $k = 1$, $O(\log n)$ -approximation. [Alamdari et.al. '14]
- $k \geq 2$, $O(k^2 \log \frac{w_{\max}}{w_{\min}})$ -approximation. [Afshani et.al. '20].



Even in 1D, optimal solution do not use disjoint cycles. Solutions with disjoint cycles are arbitrarily worse.

Questions and comments

- On Cyclic Solutions to the Min-Max Latency Multi-Robot Patrolling Problem, SoCG'2022.
- Approximation Algorithms for Multi-Robot Patrol-Scheduling with Min-Max Latency, WAFR'2020.