### Boundary Patrolling Problems

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- Different Max Speeds
  - Related Problems
- Conclusion

# **Boundary Patrolling**

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### **Motivation**

#### Patrolling problems in computer games

• Safeguard a given region/domain/territory from enemy invasions.



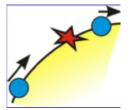
#### • Patrolling problems in robotics

• Patrolling is defined as the perpetual process of walking around an area in order to protect or supervise it.



### Problem

- A set of *k* mobile agents are placed on the boundary of a terrain.
- An intruder attempts to penetrate to the interior of the terrain through a point of the boundary, unknown to and unseen by the agents.
- The intrusion requires some period of time t.



• The agents are required to protect the boundary, arriving before the intrusion is complete.

- Each agent *i* has its own predefined maximal speed *v<sub>i</sub>*, for 1, 2, ..., *k*.
- Agents are deployed on the boundary and programmed to move around the boundary, without exceeding their maximum speed.

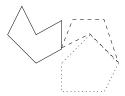
#### • Question:

for given speeds  $\{v_1, v_2, \ldots, v_k\}$  and time  $\tau$ , does there exist a deployment of agents which protects the boundary from any intruder with intrusion time not exceeding  $\tau$ ?

- How do you optimize the frequency of visits to the points of the environment?
- *Idleness (or refresh time:)* is the time elapsed since the last visit of the node.
  - Idleness can be average, worst-case, experimentally verified, etc,...
- In a way, given the input parameters you want to know what is the best effort result you can accomplish!

# **Patrolling Strategies**

• The graph (or environment) to be patrolled is usually approximated by a set of subgraphs forming a (*skeletonization*).



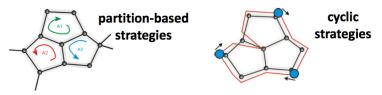
• A skeleton of the environment is defined over which patrolling is being conducted by the robots.



## **Related Work: Mostly Heuristics**

#### • Heuristics:

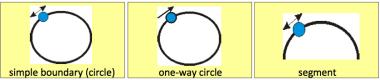
- Based on variants of TSP for agents with limited resources [survey Almeida et al. 2004]
- No coordination: reasonable only for very simple agents
  - Many random walks have smaller refresh time than one [Alon et al. 2008, Elsaesser-Sauerwald 2009]
- **Centralized coordination:** two main types of heuristics [Chevaleyre 2004]



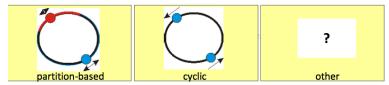
- Distributed coordination: using local information exchange
  - tokens, pebbles, white boards, ant/swarm algorithms [Yanovski et al. 2001, Elor-Bruckstein 2010]

### Results

- **Goal:** minimize maximal idle time for a set of boundary patrolling robots with distinct maximal speeds  $(v_1, v_2, ..., v_k)$
- Studied Environments



Studied Strategies



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## **Traversal Algorithm**

- The position of agent a<sub>i</sub> at time t ∈ [0,∞) is described by the continuous function a<sub>i</sub>(t).
- Hence respecting the maximal speed v<sub>i</sub> of agent a<sub>i</sub> means that for each real value t ≥ 0 and ε > 0, s.t., εv<sub>i</sub> < 1/2, the following condition is true

$$dist(a_i(t), a_i(t+\epsilon)) \le v_i \cdot \epsilon \tag{1}$$

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where  $dist(a_i(t), a_i(t + \epsilon))$  denotes the distance along the cycle between the positions of agent  $a_i$  at times t and  $t + \epsilon$ .

#### Definition (Traversal Algorithm)

A traversal algorithm on the cycle for k mobile agents is a k-tuple  $\mathcal{A} = (a_1(t), a_2(t), \dots, a_k(t))$  which satisfies Inequality (1), for all  $i = 1, 2, \dots, k$ .

#### Definition (Idle time)

Let  $\mathcal{A}$  be a traversal algorithm for a system of k mobile agents traversing the perimeter of a circle with the circumference 1.

- The idle time induced by A at a point x of the circle, denoted by I<sub>A</sub>(x), is the infimum over positive reals T > 0 such that for each K ≥ 0 there exists 1 ≤ i ≤ k and t ∈ [K, K + T] such that a<sub>i</sub>(t) = x.
- O The idle time of the system of k mobile agents induced by A is defined by I<sub>A</sub> = sup<sub>x∈C</sub> I<sub>A</sub>(x), the supremum taken over all points of the circle.
- Finally, the idle time, denoted by *I<sub>opt</sub>*, of the system of *k* mobile agents is defined by *I<sub>opt</sub>* = inf<sub>A</sub> *I<sub>A</sub>*, the infimum taken over all traversal algorithms A.

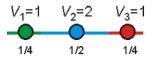
- Domain being traversed by the robots.
  - partition
  - decomposition
- Visualizing the movement of the robots
  - Using the classical concept of Distance Line Graphs: E. J. Marey. La méthode graphique. 1878.
  - The horizontal axis represents time and the vertical axis refers to the position of the corresponding agent on the circle (with 0 and 1 representing the same point).
- Proofs often elaborate.

- Algorithm 1. Proportional Partition
  - Suitable for Segments
- Algorithm 2. Uniform-Cyclic
  - Suitable for Cycles
- Algorithm 3: Hybrid
  - Combination of the above

#### • Algorithm 1. Proportional Partition

for k agents with maximal speeds  $(v_1, v_2, \ldots, v_k)$ 

Partition the unit segment into k segments, such that the length of the *i*-th segment s<sub>i</sub> equals v<sub>i</sub> v<sub>i</sub> v<sub>i</sub>.



2 For each *i*, place the *i*-th agent at any point of segment  $s_i$ .

For each *i*, the *i*-th agent moves perpetually at maximal speed, alternately visiting both endpoints of s<sub>i</sub>.

• On unit-length segment or circle, algorithm achieves idle time:

$$I=\frac{2}{v_1+v_2+\cdots+v_k}.$$

• The idle time of any strategy on the unit-length segment or circle is bounded from below by:

$$I_{OPT} \geq \frac{1}{v_1 + v_2 + \dots + v_k}$$

In general,

Proportional-Partition is a 2-approx strategy.

#### • On the circle

there are some configurations for which the approximation ratio of 2 is tight.

#### On the segment

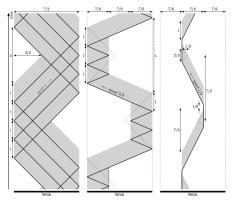
- **Theorem.** Proportional-Partition Strategy is optimal for 2 agents, and for any max speeds  $v_1, v_2$ .
- **Conjecture.** Proportional-Partition Strategy is optimal for any number of agents.

- Recall the conjecture that the maximum length of the fence that can be patrolled is  $(v_1 + \cdots + v_k)/2$ , which is achieved by the simple strategy where each agent *i* moves back and forth in a segment of length  $v_i/2$ .
- Proportional-Partition Strategy is optimal for any k and any speeds s.t. v<sub>1</sub> = v<sub>2</sub> = ··· = v<sub>k</sub>.
- Akitoshi Kawamura and Yusuke Kobayashi <sup>1</sup> prove
  - Proportional-Partition Strategy is optimal for k = 3 robots.
  - Proportional-Partition Strategy is not optimal for k = 6 robots.
- Nothing known for k = 4, 5 and k > 6.

<sup>1</sup>Fence patrolling by mobile agents with distinct speeds, ISAAC=2012=>> = ∽ < ⊂ E. Kranakis Carleton University School of Computer Science Otta Boundary Patrolling Problems

### **Proportional-Partition not optimal for** k = 6 **robots**

 Six robots with speeds 1, 1, 1, 1, 7/3, 1/2 patroling a fence of length 7/2 with idle time T = 1.



• Proportional Partition can only patrol the length  $\frac{1+1+1+1+7/3+1/2}{2} = 41/12 < 7/2$  in idle time T = 1.

# **Cyclic Strategies**

• **Goal:** deploy (some of) the robots, all moving around the circle at the same speed, with equal spacing.

#### • Algorithm 2. Uniform-Cyclic

for k agents with maximal speeds  $(v_1, v_2, \ldots, v_k)$  on the circle

• Let 
$$v_1 \geq v_2 \geq \cdots \geq v_k$$
.

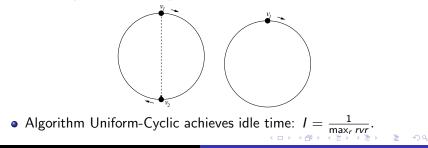
- Choose r from the range 1..k, so as to maximize: rvr
- Place agents 1, 2, ..., r at equal distances of 1/r around the circle.
- Agents 1, 2, ..., r move perpetually counterclockwise around the circle at speed v<sub>r</sub>.
- Agents r + 1, r + 2, ..., k are not used by the algorithm.
- **NB** Can employ this algorithm in either uni-directional or bi-directional circle.

# **Uniform Cyclic for** k = 2

• Consider two robots with arbitrary max speeds  $v_1 \ge v_2$ 



• In an optimal algorithm either 1) both robots patrol (left:  $v_1 < 2v_2$ ) with the speed of the slower or 2) only the faster patrols (right:  $v_1 \ge 2v_2$ ) while the slower robot is obsolete.



## Idle time of algorithm Uniform Cyclic

- Algorithm Uniform-Cyclic achieves idle time:  $I = \frac{1}{\max_{r} r v r}$ .
- Since  $I_{OPT} \ge \frac{1}{v_1 + v_2 + \dots + v_k}$ , in general, Uniform-Cyclic is a (ln k + 1)-approximation strategy.
- On the bi-directional circle...
  - **Theorem.** Uniform-Cyclic is optimal for k = 2 agents, for any  $v_1, v_2$ .
  - Note: Uniform-Cyclic is sometimes not optimal for  $k \ge 3$ .
  - On the uni-directional circle...
    - Theorem. Uniform-Cyclic Strategy is optimal for k ≤ 4 agents, for any set of max. speeds.
    - **Conjecture.** Uniform-Cyclic Strategy is optimal for any number of agents.

# **Proof Outline for** k = 3 (1/2)

- Theorem. On the uni-directional circle, algorithm Uniform-Cyclic is optimal for k ≤ 4 agents, for any set of max. speeds.
- **Proof for** k = 3
- Let  $v_1 \ge v_2 \ge v_3$
- Fix an arbitrary point x of the circle.
- Consider the infinite sequence of visits to point x by different agents.
- Define patterns as substrings of this sequence, e.g.:
  - [1,3,1] point x is visited by agent 1, next by agent 3, next by agent 1 again.
  - [2, (13)] point x is visited by agent 2, next by agents 1 and 3 (meeting at x).

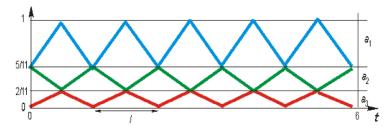
- Consider forbidden patterns: patterns which cannot appear in any strategy which has smaller idle time than algorithm Uniform-Cyclic.
  - E.g.: [3, 1, 2, 3] is a forbidden pattern, since one of the time periods between visits of two successive agents is of duration at least  $\frac{1}{3v_{a}}$ .
- All sequences containing the meeting of agents (12) include a forbidden pattern: [(12), 1][(12), 2][1, (12)][2, (12)][3, (12), 3]
- Thus, agents 1 and 2 can never meet in a better strategy.
- Likewise, we show that no pair of agents can ever meet, and in the limit, the idle time of Uniform-Cyclic cannot be beaten.

### **Three Case Studies**

- Can the ability of agents to change directions improve the idle time?
  - We have shown that this is not the case for any setting involving *k* = 2 agents.
  - However, there are settings already for k = 3 agents, when using negative speeds (i.e., reversing direction) by the participating agents leads to a better idle time.
- Three Case Studies
  - Proportional Partition Algorithm
  - Uniform Cyclic Algorithm
  - Hybrid Algorithm

## **Case Study: Proportional Partition**

- Horizontal axis represents time; vertical axis refers to the position of the corresponding agent on the circle (with 0 and 1 representing the same point)
- Two-directional circle,  $k = 3, v_1 = 1, v_2 = 1/2, v_3 = 1/3$



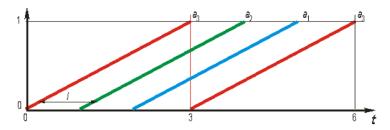
• Proportional-Partition Algorithm:

$$I = \frac{1}{1 + 1/2 + 1/3} = \frac{12}{11}$$

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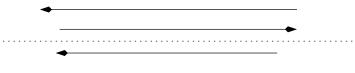
# Case Study: Uniform

- Horizontal axis represents time; vertical axis refers to the position of the corresponding agent on the circle (with 0 and 1 representing the same point)
- Two-directional circle,  $k = 3, v_1 = 1, v_2 = 1/2, v_3 = 1/3$



• Uniform-Cyclic:

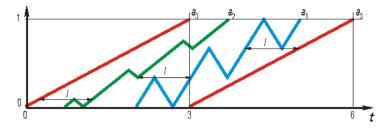
- A "partition" strategy may not necessarily be optimal.
- Instead robots are allocated "overlapping" subdomains dynamically.
- In the picture below



by reversing direction, a faster robot can help a slower moving robot reduce the idle time.

# Case Study: Hybrid

- Horizontal axis represents time; vertical axis refers to the position of the corresponding agent on the circle (with 0 and 1 representing the same point)
- There exist settings such that in order to achieve the optimal idle time, some agents need to move in both directions.
- two-directional circle,  $k = 3, v_1 = 1, v_2 = 1/2, v_3 = 1/3$



• A hybrid strategy:

$$I = 35/36 < 1$$

# **Lonely Runners**

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# Similarities to Lonely Runner (Willis 1967)

- **Problem** There are *k* runners on a unit circle, running perpetually around with **constant** speeds {*v*<sub>1</sub>, *v*<sub>2</sub>,..., *v*<sub>k</sub>}.
- They all start together from the same starting spot and continue running at their own speed forever.
- They never vary their speeds, stop, or interfere with each other.



• **Question:** Is it always true that for every runner, at some moment in time, their distance from the nearest runner will be at least 1/k?



- 40 years of incremental progress.
- Solved for  $k \leq 6$ .

k	Year Proved	Proved by
3	1972	Betke and Wills; Cusick
4	1984	Cusick and Pomerance; Bienia et al.
5	2001	Bohman, Holzman, Kleitman; Renault
6	2008	Barajas and Serra

- Problem difficult even for specific speeds.
- Some very recent progress using dynamic systems theory.
- Problem related to Diophantine approximation theory (Littlewood's conjecture) and number theory (Goldbach's and Polignac's conjectures).

### **Example:** Runners from the Origin

- k runners start at 0, running at speeds 1, 2, ..., k.
- **Question:** Will there be a time when each runner will be distance at least  $\frac{2}{k}$  from the start?
- Claim: With positive probability there will be no runners in the interval I = [-a, a], for some a.
  - Let  $E_i$  be the event that the *i*-th runner is in the interval *I*.
  - Since cycle has length one and a runner with speed *i* performs *i* laps in a unit of time,  $Pr[E_i] = 2a$ , for each *i*.
  - Therefore  $\Pr[\exists (runner in the interval I)] \le \sum_{i=1}^{k} 2a = 2ka$ .
  - For  $a < \frac{1}{2k}$  we derive that

 $Pr[no runner is in the interval I] \ge 1 - 2ka > 0.$ 

• Recall *I* has length 2*a*, which is  $\approx \frac{1}{k}$ , when  $a \approx \frac{1}{2k}$ .

- One of the main difficulties is that robots get to choose their speeds (up to a max value).
- What is the optimal solution to the boundary patrolling problem on the circle for agents with known maximal speeds?

• solved for  $k \leq 2$ .

- Is a Proportional-Partition strategy optimal on the segment?
  - proved for  $k \leq 2$ .
- Is Uniform-Cyclic strategy optimal on uni-directional cycle?
  proved for k ≤ 4.
- Which strategies will work best for patroling problems in geometric scenarios (area patrolling) and in graphs?

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• How about fragmented domains?

- J. Czyzowicz, L. Gasieniec. A. Kosowski, E. Kranakis. Boundary Patrolling by Mobile Agents with Distinct Maximal Speeds. In proceedings of 19th European Symposium on Algorithms. ESA 2011.
- A. Collins, J. Czyzowicz, L. Gasieniec, A. Kosowski, E. Kranakis, D. Krizanc, R. Martin, O. Morales Ponce. Optimal Patrolling of Fragmented Boundaries. SPAA 2013.