# Optimal Circle Search Despite the Presence of Faulty Robots

K. Georgiou<sup>1</sup>, E. Kranakis<sup>2</sup>, N. Leonardos<sup>3</sup>, A. Pagourtzis<sup>4</sup>, I. Papaioannou<sup>4</sup>

September 12, 2019

<sup>1</sup>Ryerson University
 <sup>2</sup>Carleton University
 <sup>3</sup>University of Athens
 <sup>4</sup>National Technical University of Athens

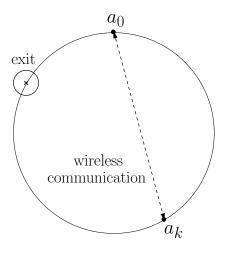
# Search problem

Searching an environment to find an exit (or target) in the minimum possible time:

- Autonomous robots (mobile agents)
- (may) cooperate
- exchange messages

Searching for an exit placed at an unknown location:

- on the perimeter of a unit circle
- wireless communication
- crash/byzantine faults



### Communication

- wirelessly and instantaneously
- anytime and regardless of distance
- message tagged with robot's unique ID (cannot be altered)

#### Robot movement

- start possition: center of the circle
- maximum speed is 1 (same for all robots)
- recognize and move along the perimeter of the circle
- recognize exit if they are at its location
- allowed to take "shortcuts" by moving in the interior of the disk
- trajectories known, and can be deduced

# Computational model

### Fault types

- Crash faults
  - stop functioning at any time
  - permanently remains idle and/or fails to communicate
- Byzantine faults
  - may alter trajectory
  - provide (or hide) information to confuse the rest
  - can exhibit behavior of a crash-faulty robot

### Adversary

- controls the location of the exit
- controls the behaviour of the malicious robot
- goal to maximize the resulting search completion time

### Linear Search

Single mobile agent searching for an exit placed at an unknown location on an infinite line. (Cow Path Problem)

- Bellman (1963), Beck (1964), Baeza-Yates et al. (1993)
- Ahlswede and Wegener, Alpern and Gal, Stone

### Presence of faulty robots

- Crash-faulty: Czyzowicz, Kranakis et al. (2016)
- Byzantine-faulty: Czyzowicz, Georgiou et al. (2016)

### Circle Search

- Introduced as an *evacuation* problem (minimize evacuation time) and analyzed in *Czyzowicz et al. (2014)*.
- Czyzowicz et al. (2017) investigate evacuation in the presence of crash and/or Byzantine faults.

### A search is complete if:

- exit visited by a non-faulty robot
- the rest of the agents can be convinced of the location of the exit

### (n, f)-search on a circle:

n > 1 robots searching for an exit in a circle of unit radius, f of which are faulty. Robots start at the center of the circle and can move anywhere with maximum speed 1.

#### •Presence of Crash Faults:

Optimal algorithms for the (n, f)-search problem Optimal worst case completion time  $1 + \frac{(f+1)2\pi}{n}$ 

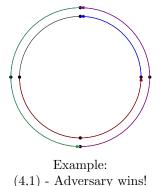
### •Presence of Byzantine Faults:

Optimal algorithms for (n, 1)-search problem Optimal worst case completion time  $1 + \frac{4\pi}{n}$ 

#### Theorem (Lower Bound for (n, f)-Search)

The worst-case search time  $S_c(n, f)$  for  $n \ge f + 1$  robots exactly f of which are crash-faulty satisfies

$$S_c(n, f) \ge 1 + (f+1)\frac{2\pi}{n}$$



We must traverse every point of the circle with at least (f + 1) robots.

If not the adversary will make at most f robots visit the exit and remain silent.

Honest robots will miss the exit

#### Theorem (Lower Bound for (n, f)-Search)

The worst-case search time  $S_c(n, f)$  for  $n \ge f + 1$  robots exactly f of which are crash-faulty satisfies

$$S_c(n, f) \ge 1 + (f+1)\frac{2\pi}{n}$$

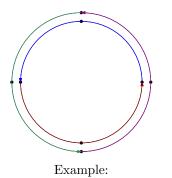
#### Corollary (Lower Bound for Byzantine (n, 1)-Search)

The worst-case search time S(n) for  $n \ge 2$  robots exactly one of which is Byzantine-faulty satisfies  $S(n) \ge 1 + \frac{4\pi}{n}$ .

#### Theorem (Upper Bound for (n, f)-Search with Crash Faults)

The worst-case search time  $S_c(n, f)$  for  $n \ge 2$  robots exactly f of which are prone to crash failures satisfies

$$S_c(n, f) \le 1 + (f+1)\frac{2\pi}{n}$$



(4,1): Search complete!

• 
$$\theta = \frac{2\pi}{n}$$

•  $a_k$  moves t  $k\theta$  and searches ccw for  $(f+1)\theta$  radians

#### Theorem (Upper Bound for (n, f)-Search with Crash Faults)

The worst-case search time  $S_c(n, f)$  for  $n \ge 2$  robots exactly f of which are prone to crash failures satisfies

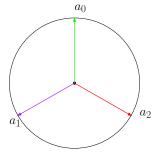
$$S_c(n, f) \le 1 + (f+1)\frac{2\pi}{n}$$

Bounds for crash faults are tight.

#### Lemma ((3,1)-Search)

The worst-case search time for 3 robots exactly one of which is Byzantine-faulty satisfies

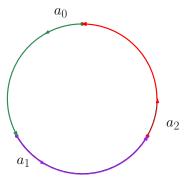
$$S(3) \le 1 + \frac{4\pi}{3}$$



**Step 0**: time phase [0,1)

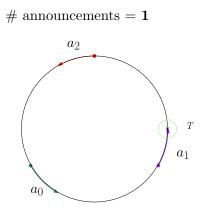
- Divide circle in 3 sectors, set  $\theta = \frac{2\pi}{3}$
- agent  $a_k$  move to location  $k\theta$
- in the next phase  $[1, 1 + \theta)$ , agent  $a_k$  searches ccw arc  $[k\theta, (k+1)\theta]$

# announcements = 0



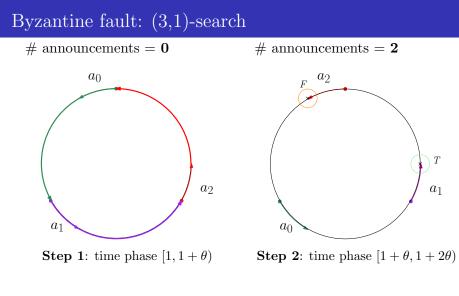
**Step 1**: time phase  $[1, 1 + \theta)$ 

• exit on territory of faulty robot



**Step 2**: time phase  $[1 + \theta, 1 + 2\theta)$ 

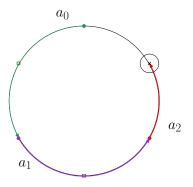
• correct announcement



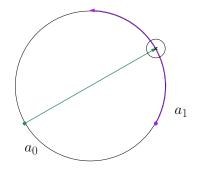
• exit on territory of faulty robot

third agent (say a<sub>0</sub>), honest
a<sub>0</sub> could find the exit in previous phase, if a<sub>2</sub> was honest

# announcements = 1



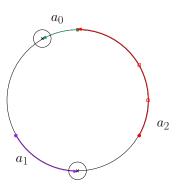
**Step 1**: time phase  $[1, 1+\theta)$ 



**Step 2**: time phase  $[1 + \theta, 1 + 2\theta)$ 

- correct if  $a_0$  or  $a_1$  confirms
- otherwise  $a_1$  will find it
- max time  $2 < \theta$

# announcements = 2



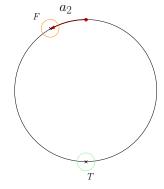
**Step 1**: time phase  $[1, 1 + \theta)$ 

- consecutive sectors
- silent agent is honest

**Step 2**: time phase  $[1 + \theta, 1 + 2\theta)$ 

• honest agent will determine the correct exit

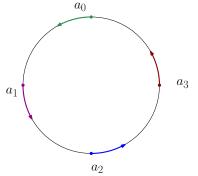
max time 
$$1 + 2\theta = 1 + \frac{4\pi}{n} = 1 + \frac{4\pi}{3}$$



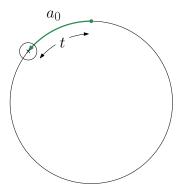
#### Lemma ((4,1)-Search)

The search time for 4 robots exactly one of which is Byzantine-faulty satisfies

$$S(4) \le 1 + \pi$$

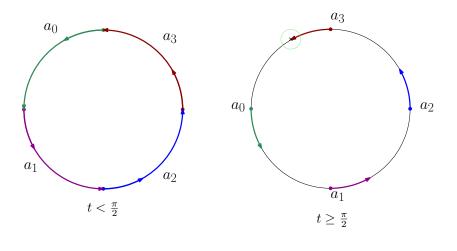


- set  $\theta = \frac{\pi}{2}$
- agent  $a_k$  moves to  $k\theta$  and continues ccw
- each responsible for arc of length  $\pi$



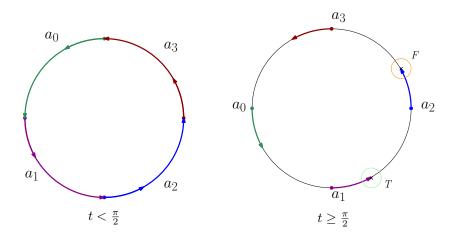
• t: length of arc searched by the agent who made first announcement, at the time of announcement

**Case 1**: # announcements in  $t \ge \frac{\pi}{2}$ : 1



• valid one

**Case 1**: # announcements in  $t \geq \frac{\pi}{2}$ : 2



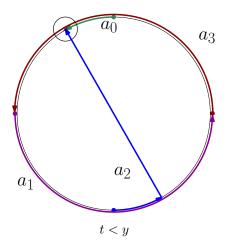
• consecutive sectors

• valid the first in ccw direction

• In Case 1, where  $t \ge \frac{\pi}{2}$ , robots will know the correct exit when they check the sectors they are responsible for in time  $1 + \pi$ 

 $\bullet$  Otherwise, set  $y=\pi-2$  and suppose an announcement is made by  $a_0$  at  $t<\frac{\pi}{2}$ 

**Case 2**: announcements in t < y

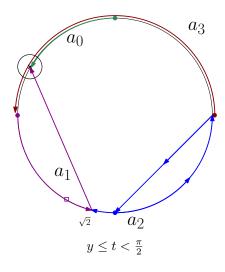


•  $a_1$  and  $a_3$  will search the two sectors that each is responsible for in time

•  $a_2$  will move along a diameter to check the announcement

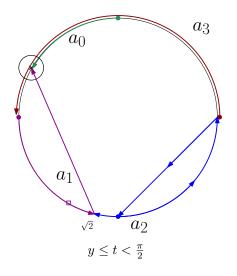
• y is defined so that  $a_2$  reaches the announcement in time less than  $1 + y + 2 = 1 + \pi$ 

**Case 3**: announcements in  $y \le t < \frac{\pi}{2}$ 



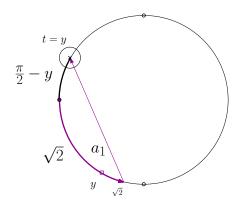
- $a_1$  continues to cover distance  $\sqrt{2}$
- then moves along a chord to check announcement
- $a_2$  finishes first sector and moves back through a chord to check the arc that  $a_1$  left unchecked
- $a_3$  continues to search his two sectors

**Case 3**: announcements in  $y \le t < \frac{\pi}{2}$ 



•  $a_2$  covered an arc of at most  $\frac{\pi}{2} + \sqrt{2} + (\frac{\pi}{2} - \sqrt{2}) = \pi$ 

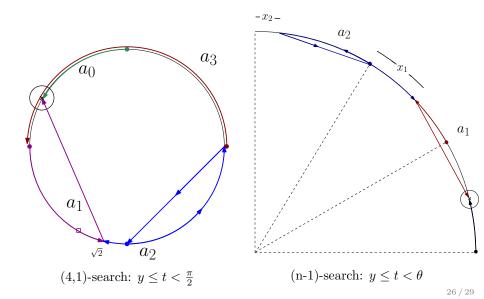
**Case 3**: announcements in  $y \le t < \frac{\pi}{2}$ 



- $a_1$  in the worst case where t = y will walk a chord that corresponds to an arc of lenght  $\phi = \sqrt{2} + \frac{\pi}{2} - y = 2 + \sqrt{2} - \frac{\pi}{2}$
- total time needed is  $1 + \sqrt{2} + 2\sin\frac{\phi}{2} < 1 + \pi$

max time  $1 + \frac{4\pi}{n} = 1 + \pi$ 

# Byzantine fault: (n,1)-search, $n \ge 5$



# Byzantine fault: (n,1)-search, $n \ge 5$

- Analytical proof for  $n \ge 9$
- After some computational verification...

$\left  n \right $	$x_5$	$x_4$	$x_3$	$x_2$	$x_1$	y	Т	S(n)
5				0.0810	0.2285	0.611	3.51327	3.51327
6			0.047	0.135	0.3	0.36	3.07	3.09
7		0.029	0.085	$0.17^{*}$	$0.34^{*}$	0.2	2.74	2.79
8	0.02	$0.04^{*}$	$0.08^{*}$	$0.16^{*}$	$0.32^{*}$	0.1	2.56	2.57

#### Theorem (Upper Bound for (n,1)-Search)

The worst-case search time S(n) for  $n \ge 2$  robots exactly one of which is Byzantine-faulty satisfies

$$S(n) \le 1 + \frac{4\pi}{n}$$

Bounds for one Byzantine fault are tight!

### Conclusion

Search on a circle with n robots, where

- $f \ge 1$  crash-faulty
  - Optimal worst-case search time is exactly  $1 + \frac{(f+1)2\pi}{n}$
- one of them is Byzantine-faulty
  - Optimal worst-case search time is exactly  $1 + \frac{4\pi}{n}$

### **Open problems**

- Multiple Byzantine-faulty robots
- Evacuation
- Other topologies
- Other communication models

# Thank you!