## Optimal Circle Search Despite the Presence of Faulty Robots

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## 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



## Computational model

## 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


## Related Work

## 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.


## Search with 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.


## Our results

-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 $1+\frac{4 \pi}{n}$

## Crash Faults: Lower Bound

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

The worst-case search time $S_{c}(n, f)$ for $n \geq f+1$ robots exactly $f$ of which are crash-faulty satisfies

$$
S_{c}(n, f) \geq 1+(f+1) \frac{2 \pi}{n}
$$



Example:
$(4,1)$ - Adversary wins!

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

## Crash Faults: Lower Bound

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

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$$
S_{c}(n, f) \geq 1+(f+1) \frac{2 \pi}{n}
$$

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

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

## Crash Faults: Upper Bound

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

The worst-case search time $S_{c}(n, f)$ for $n \geq 2$ robots exactly $f$ of which are prone to crash failures satisfies

$$
S_{c}(n, f) \leq 1+(f+1) \frac{2 \pi}{n}
$$



- $\theta=\frac{2 \pi}{n}$
- $a_{k}$ moves $\mathrm{t} k \theta$ and searches ccw for $(f+1) \theta$ radians

Example:
$(4,1)$ : Search complete!

## Crash Faults: Upper Bound

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

The worst-case search time $S_{c}(n, f)$ for $n \geq 2$ robots exactly $f$ of which are prone to crash failures satisfies

$$
S_{c}(n, f) \leq 1+(f+1) \frac{2 \pi}{n}
$$

Bounds for crash faults are tight.

## Byzantine fault: $(3,1)$-search

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

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

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



- 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 $[k \theta,(k+1) \theta]$

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

## Byzantine fault: $(3,1)$-search

$\#$ announcements $=\mathbf{0}$


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

- exit on territory of faulty robot
$\#$ announcements $=1$


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

- correct announcement


## Byzantine fault: $(3,1)$-search

\# announcements $=\mathbf{0}$


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

- exit on territory of faulty robot
$\#$ announcements $=\mathbf{2}$


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

- third agent (say $a_{0}$ ), honest
- $a_{0}$ could find the exit in previous phase, if $a_{2}$ was honest


## Byzantine fault: $(3,1)$-search

\# announcements $=\mathbf{1}$


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 $2<\theta$


## Byzantine fault: $(3,1)$-search

\# announcements $=\mathbf{2}$


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

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

## Byzantine fault: $(4,1)$-search

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

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

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



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


## Byzantine fault: $(4,1)$-search



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


## Byzantine fault: $(4,1)$-search

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


- valid one


## Byzantine fault: $(4,1)$-search

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

$t<\frac{\pi}{2}$

$t \geq \frac{\pi}{2}$

- consecutive sectors
- valid the first in ccw direction


## Byzantine fault: $(4,1)$-search

- In Case 1, where $t \geq \frac{\pi}{2}$, robots will know the correct exit when they check the sectors they are responsible for in time $1+\pi$
- Otherwise, set $y=\pi-2$ and suppose an announcement is made by $a_{0}$ at $t<\frac{\pi}{2}$


## Byzantine fault: $(4,1)$-search

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 $1+y+2=1+\pi$


## Byzantine fault: $(4,1)$-search

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


- $a_{1}$ 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


## Byzantine fault: $(4,1)$-search

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


- $a_{2}$ covered an arc of at most $\frac{\pi}{2}+\sqrt{2}+\left(\frac{\pi}{2}-\sqrt{2}\right)=\pi$


## Byzantine fault: $(4,1)$-search

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


- $a_{1}$ 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, $n \geq 5$


(4,1)-search: $y \leq t<\frac{\pi}{2}$

(n-1)-search: $y \leq t<\theta$

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

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

| $n$ | $x_{5}$ | $x_{4}$ | $x_{3}$ | $x_{2}$ | $x_{1}$ | $y$ | $T$ | $S(n)$ |
| :---: | :--- | :--- | :--- | :--- | :--- | :---: | :---: | :---: |
| 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 ( $\mathrm{n}, 1$ )-Search)

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

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

Bounds for one Byzantine fault are tight!

## Conclusion

Search on a circle with $n$ robots, where

- $f \geq 1$ 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!


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