



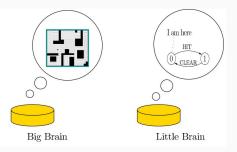
# Periodic Trajectories of Mobile Robots

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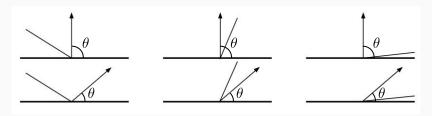
# Simple Mobile Robots

- Mobile robots can vacuum floors, transport goods in warehouses, act as security robots (patrol), etc
- We want to minimize sensing and computation
  - make robots less expensive, more energy efficient
- Often, robots can bump into things and be ok!
- How can we use contact with the environment as a strategy or source of information?



# Blind, Bouncing Robots<sup>1</sup>

Abstract the robot as a point moving in straight lines in the plane, "bouncing" off the boundary at a fixed angle  $\theta$  from the normal:

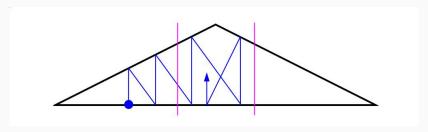


**Figure 1:** A point robot moving in the plane. The top row shows bounces at zero degrees from the normal. The second row shows bounces at 50 degrees clockwise from normal.

<sup>&</sup>lt;sup>1</sup>(Erickson and LaValle 2013), ICRA

#### **Research Questions**

Given a constant control strategy, will the robot become "trapped" in part of the environment? Or in a certain motion pattern? We focus on **patrolling**: periodically orbiting the workspace.



**Figure 2:** In this environment, bouncing at the normal, the robot will become trapped in the area between the purple lines

### **Implementation**

 In scenarios where we need to patrol, we often know something about the geometry of the space

#### But is it physically realizable?

- Can implement on a roomba with bump sensor and IR prox detector<sup>2</sup>
- "Collisions" can be virtual for example, robot stops when it is collinear with two landmarks, and rotates until one landmark is at a certain heading

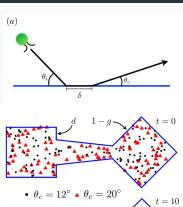
<sup>&</sup>lt;sup>2</sup>(Lewis and O'Kane 2013), IJRR

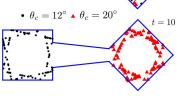
#### **Related Work in Robotics**

- Minimal sensing, actuation, computation requirements for mapping, navigating, localizing, patrolling, pursuit evasion (Tovar, Guilamo, and LaValle (2005), Bilò et al. (2012), J. M. O'Kane and LaValle (2007), Disser (2011))
- Overlaps with design automation: formalize tradeoffs between sensor and actuator power, computational complexity, energy use, etc
  - ICRA 1996 workshop, RSS '08, '16, '17

# Related Work in Dynamical Systems

- Specular billiards (Tabachnikov (2005))
- Pinball billiards
  (Markarian, Pujals,
  and Sambarino
  (2010))
- Aspecular billiards, microorganism billiards (Spagnolie et al. (2017))





Limit Cycles In Regular Polygons

#### Question

If we can only move in straight lines and align relative to wall normal:

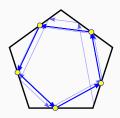
Can we guarantee that a robot **patrols** a space on a periodic path?

#### Can also phrase as:

What are the conditions on limit cycles in this dynamical system?

# Discovery Through Simulation

- Haskell with *Diagrams* library (Yorgey 2012)
- Fixed-angle bouncing, relative bouncing (rotate  $\theta$  from previous heading), specular bouncing, add noise
- Render diagrams from simulations automatically<sup>3</sup>



<sup>&</sup>lt;sup>3</sup>https://github.com/alexandroid000/bounce

# In Regular Polygons

Ignore movement in interior, only track position on boundary when robot collides. Defines a **discrete dynamical system** 

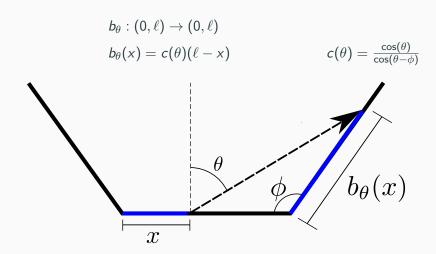
$$x_{n+1}=f(x_n)$$

Given regular polygon, with edge length  $\ell$  and internal angle  $\phi$ , we can define the mapping function

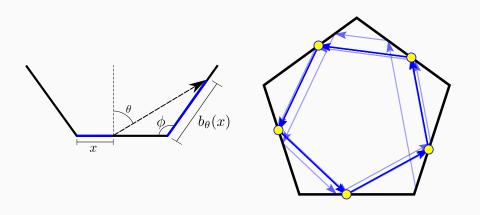
$$b_{\theta}:(0,\ell)\to(0,\ell)$$

# Sequential-Edge Bouncing

In regular polygons with side length  $\ell$  and internal angle  $\phi$ :



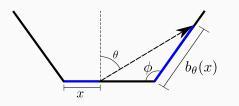
# Fixed Point of Mapping Function ← Periodic Orbit



#### What is the Fixed Point?

#### **Mapping Function**

$$b_{\theta}(x) = c(\theta)(\ell - x)$$
  $c(\theta) = \frac{\cos(\theta)}{\cos(\theta - \phi)}$ 



$$b_{\theta}(x_{FP}) = x_{FP}$$
$$c(\theta)(\ell - x_{FP}) = x_{FP}$$
$$x_{FP} = \frac{\ell c(\theta)}{1 + c(\theta)}$$

For clockwise bouncing, reflect across the midpoint of the edge:

$$\rightarrow \ell - x_{FP}$$

# Is the Fixed Point Unique?

#### **Mapping Function**

$$b_{\theta}(x) = c(\theta)(\ell - x)$$
  $c(\theta) = \frac{\cos(\theta)}{\cos(\theta - \phi)}$ 

When we check how distances change under the map, we see that

$$egin{aligned} d(b_{ heta}(x),b_{ heta}(y)) &= |c( heta)(\ell-y)-c( heta)(\ell-x)| \ &= |c( heta)(x-y)| \ &= |c( heta)|d(x,y). \end{aligned}$$

Thus if  $|c(\theta)| < 1$ , then  $b_{\theta}$  is a contraction mapping, and by the Banach fixed-point theorem, it has a unique fixed point (Granas and Dugundji 2003).

#### Bounds on $\theta$

To get bounds on  $\theta$  for guaranteeing periodic trajectories:

- Solve  $\left|\frac{\cos(\theta)}{\cos(\theta-\phi)}\right| < 1$
- Take geometric feasibility into account (for non-regular polygons)

So now we have a statement for the existence and stability of the fixed points, for counterclockwise bouncing striking each edge of a regular polygon:

#### **Proposition**

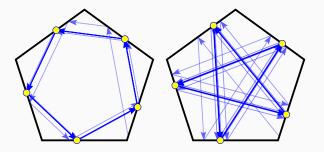
$$\mathbf{x}_{FP} = \begin{cases} \frac{\ell c(\theta)}{1+c(\theta)} & \phi/2 < \theta < \pi/2 \\ \frac{\ell}{1+c(\theta)} & -\pi/2 < \theta < -\phi/2 \end{cases}$$

in which 
$$c(\theta) = \cos(\theta)/\cos(\theta - \phi)$$
.

#### **Confirmation and Generalization**

We have shown the case for counterclockwise bounces, on every sequential edge.

We can also imagine going clockwise, and/or skipping edges:



Mapping function, convergence conditions go through very similarly (see paper)

#### Generalization

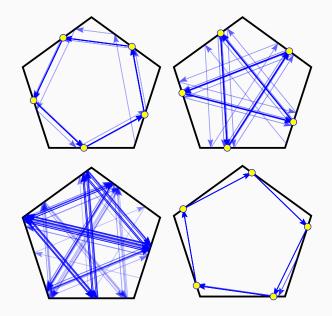
In every regular n-sided polygon with side length I and interior angle  $(n-2)\pi/n$ , there exists a range for  $\theta$  such that iterating  $B_{\theta}(x)$  on any  $x \in \delta P$ , results in a stable limit cycle that strikes the boundary skipping m-1 edges, and strikes at points that are distance  $x_{FP}$  from the nearest clockwise vertex, with  $x_{FP}$  given by

$$x_{FP} = \begin{cases} \frac{l - A(1 - c(\theta))}{1 + c(\theta)}, & \frac{\phi_m}{2} < \theta < \frac{\phi_{m-1}}{2} \\ \frac{lc(-\theta) + A(1 - c(-\theta))}{1 + c(-\theta)}, & \frac{-\phi_{m-1}}{2} < \theta < \frac{-\phi_m}{2} \end{cases}$$
(1)

in which

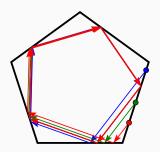
$$\begin{split} \phi_m &= \frac{\pi(n-2m)}{n}, \\ A &= \frac{I\sin(\frac{\pi(m+1)}{n})\sin(\frac{m\pi}{n})}{\sin(\frac{\pi}{n})\sin(\frac{\pi(n-2m)}{n})}, \text{ and } \\ c(\theta) &= \cos(\theta)/\cos\left(\theta - \frac{\pi(n-2m)}{n}\right). \end{split}$$

### **Simulation Results**



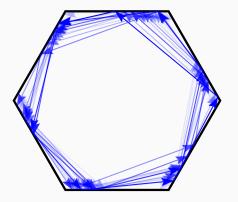
# **Nice Properties**

- Any regular n-gon
- Stable orbits are independent of starting position
- Exponential convergence



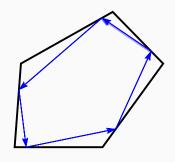
# **Adding Noise**

We got bounds on  $\theta$  from  $|c(\theta)| < 1$ : any angle in this range will make similar orbits

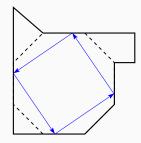


**Figure 5:** 200 bounces with uniformly distributed error added to  $\theta$ , -0.1 rad  $\leq \epsilon \leq 0.1$  rad

# Other Polygons



(a) A stable orbit in a sheared pentagon.



**(b)** A stable orbit in a nonconvex environment.

Figure 6: Stable orbits also exist in non-regular polygons.

# **Open Problems & Future Work**

- How to characterize and exploit non-periodic dynamics?
  - Lyapunov exponents suggest chaotic dynamics
  - relationship to dispersion: what is the longest unvisited edge interval as the system evolves?
- Extensions to non-regular polygons and smooth environments
- Error bounds: model different disturbances to bounce
- Feedback control: counting number of bounces, make walls distinguishable / colored, allow robot to place and/or detect landmarks

# Thank you!

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