



# Interesting Trajectories of Mobile Robots in Polygons

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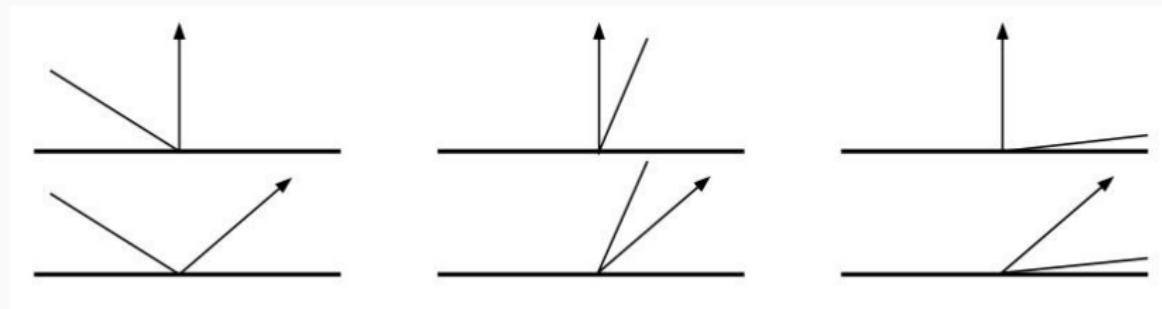
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May 18, 2017

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

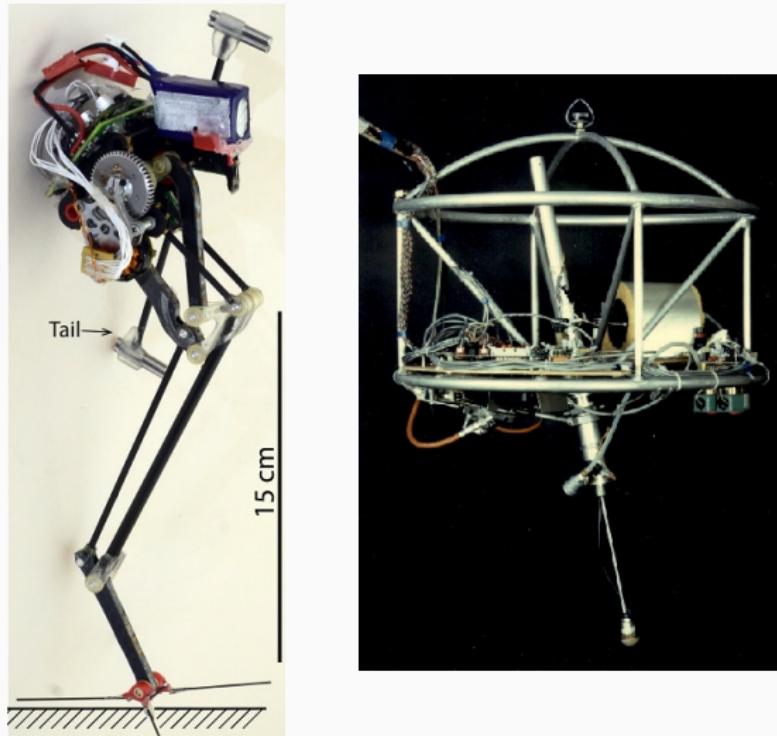


**Figure 1:** A point robot moving in the plane. The top row shows “bounces” at zero degrees from the normal. The second row shows bounces at 50 degrees clockwise from normal.

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<sup>1</sup>(Erickson and LaValle 2013)

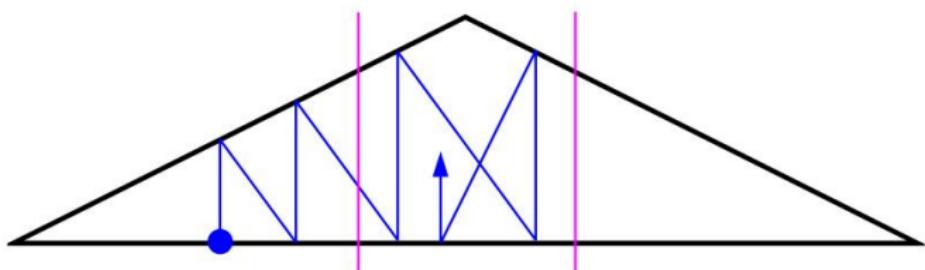
# Bouncing Robots



**Figure 2:** No, not that kind of bouncing robot...

## Research Questions

- What kind of tasks are robots with extremely simple control laws capable of performing?
- Will the robot become “trapped” in a certain part of the environment? Or a certain motion pattern?



**Figure 3:** In this environment, bouncing at the normal, the robot will become trapped in the area between the purple lines.

## Ok, but why?

- platform invariant: just need two primitives
  - move straight
  - align wrt wall normal
- very simple control schemes
- predictable, reliable motion control in structured spaces
  - warehouses
  - monitor environmental conditions

## Ok, but is it physically realizable?

- can implement<sup>2</sup> on a roomba with bump and IR prox detector
- “rotate to parallel”
- maximum error in angle of  $\pm 10^\circ$

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<sup>2</sup>(Lewis and O’Kane 2013)

## Related Work

- dynamical billiards: specular bouncing<sup>3</sup>
- pinball billiards<sup>4</sup>
- aspecular billiards, microorganism billiards<sup>5</sup>
- minimal sensing, actuation, computation requirements for point robots in polygons: mapping, navigating, localizing, patrolling, pursuit evasion<sup>6</sup>

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<sup>3</sup>(Tabachnikov 2005)

<sup>4</sup>(Markarian, Pujals, and Sambarino 2010)

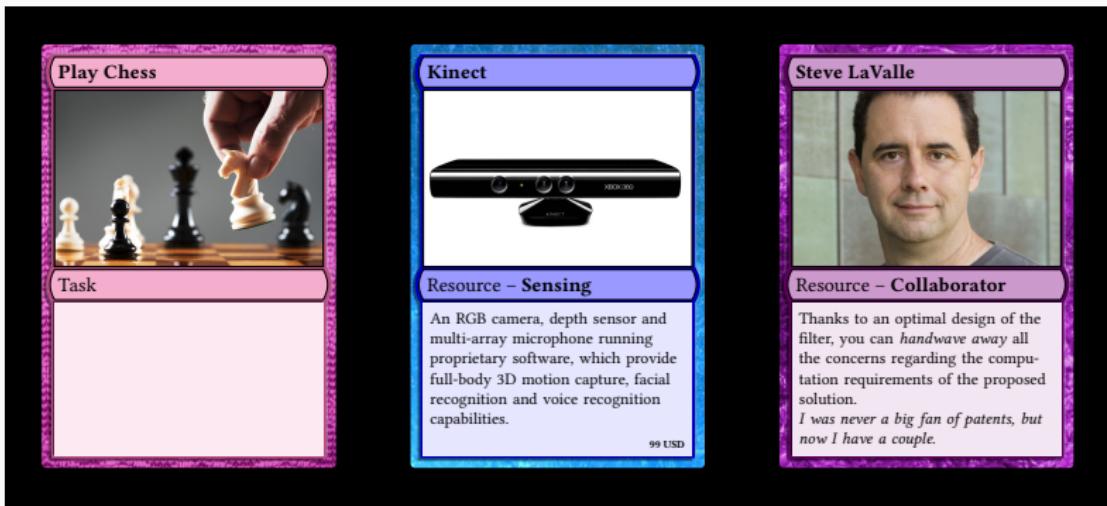
<sup>5</sup>(Spagnolie et al. 2017)

<sup>6</sup>(Tovar, Guilamo, and LaValle 2005) (Bilò et al. 2012) (J. M. O'Kane and LaValle 2007) (Disser 2011)

## Can Imagine Variations on this Model

- **sensors:** gap visibility, detect corners, detect wall normals, pebbles, linear and angular odometers, + noise
- **actuators:** move straight forward, bounce specularly, wall following, rotate in place, + noise
- can we explore this design space in a more systematic and automated way?
  - what is the role of formal methods?

# RSS Workshop: *Minimality and Trade-offs in Automated Robot Design*



- July 16
- <http://minimality.mit.edu/>
- Your chance to become immortalized in a card game!

# Limit Cycles In Regular Polygons

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## Question

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

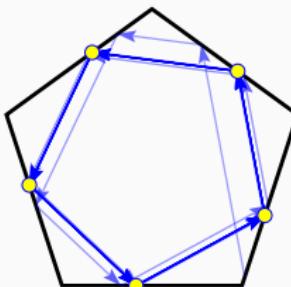
*Can we guarantee that a robot **patrols** a space on a periodic path?*

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, specular bouncing, add noise
- render diagrams from simulations automatically<sup>7</sup>



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<sup>7</sup><https://github.com/alexandroid000/bounce>

## In Regular Polygons

Defines a **discrete dynamical system**

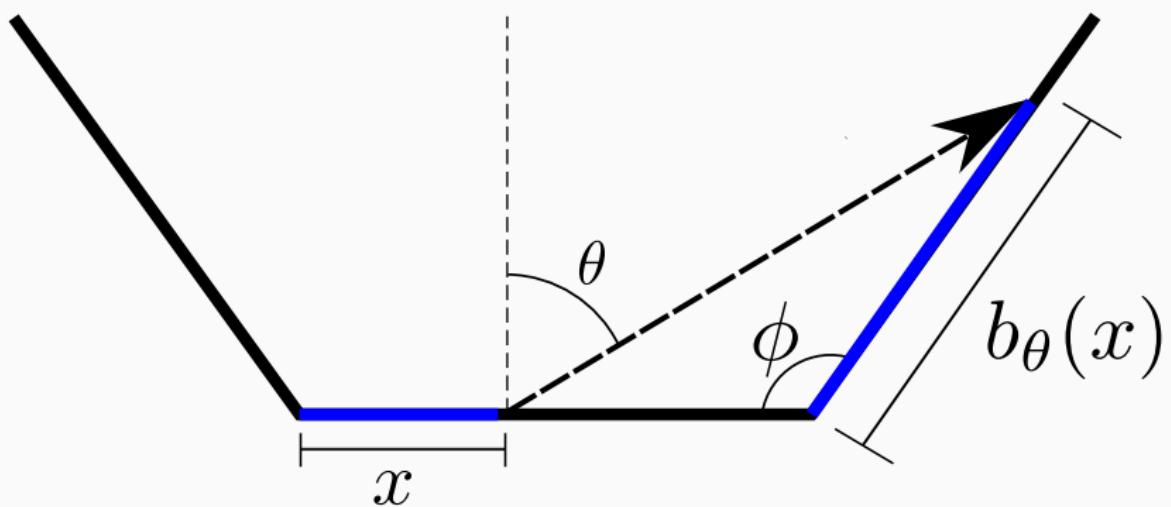
$$x_{n+1} = f(x_n)$$

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

$$b_\theta : (0, l) \rightarrow (0, l)$$

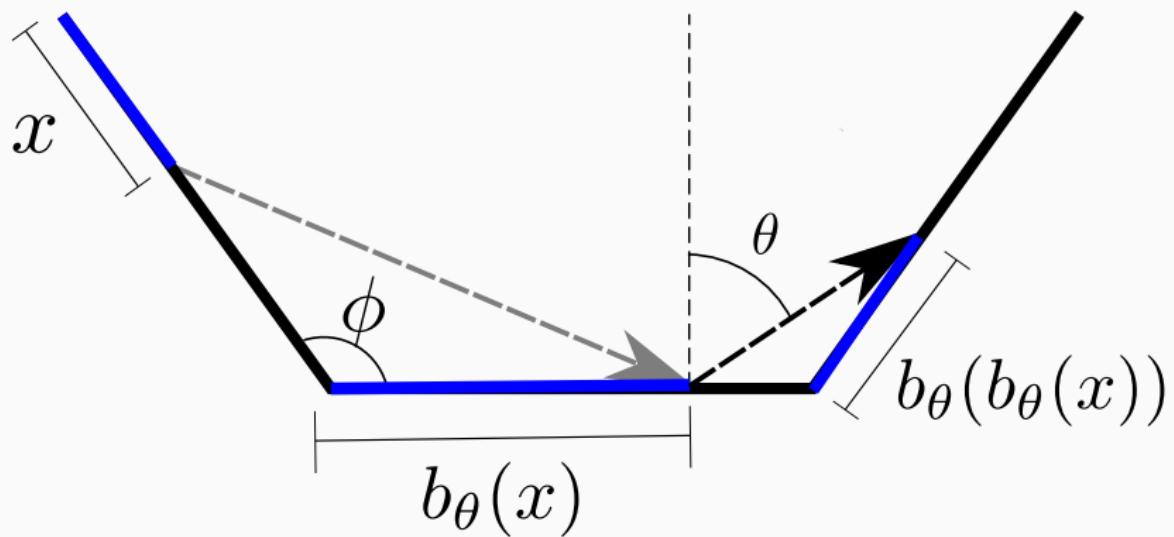
## Sequential-Edge Bouncing

$$b_\theta : (0, l) \rightarrow (0, l)$$



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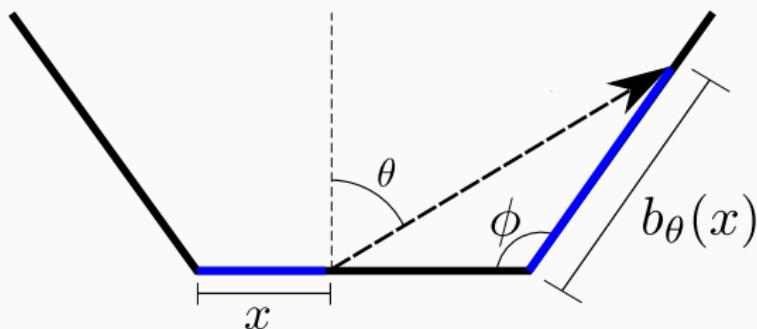


## Do the geometry and...

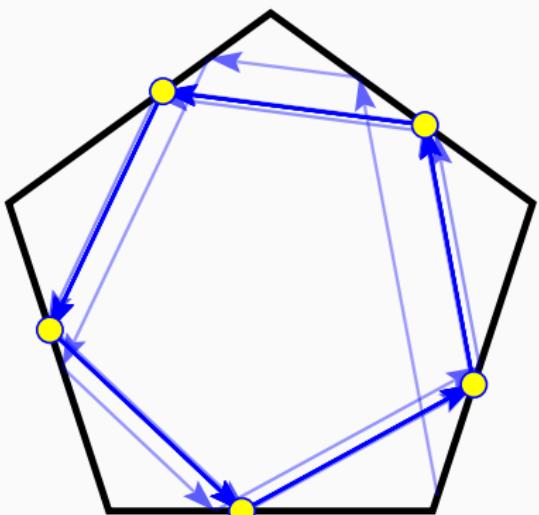
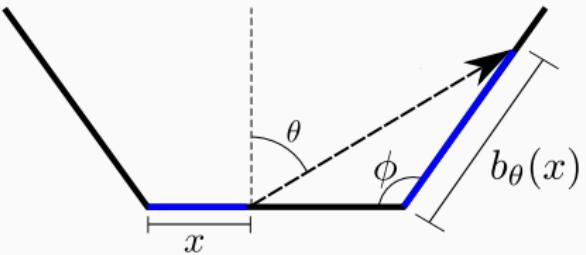
$$\frac{b_\theta(x)}{\sin(\pi/2 - \theta)} = \frac{l - x}{\sin(\pi - (\pi/2 - \theta) - \phi)}$$

which we can rewrite as

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



# Fixed Point of Mapping Function $\iff$ Periodic Orbit



# Is There a Unique Fixed Point?

## Lemma

If  $|c(\theta)| < 1$ , then  $b_\theta(x)$  is a contraction mapping and has a unique fixed point.

## Proof:

We take  $(0, l)$  to be a metric space with metric  $d(x, y) = |y - x|$ . To be a contraction mapping,  $b_\theta$  must satisfy

$$d(b_\theta(x), b_\theta(y)) \leq kd(x, y)$$

for all  $x, y \in (0, l)$  and some nonnegative real number  $0 \leq k < 1$  (Granas and Dugundji 2003).

## Is There a Unique Fixed Point?

$$b_\theta(x) = c(\theta)(I - x)$$

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

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

$$\begin{aligned} d(b_\theta(x), b_\theta(y)) &= |c(\theta)(I - y) - c(\theta)(I - x)| \\ &= |c(\theta)(x - y)| \\ &= |c(\theta)|d(x, y). \end{aligned}$$

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.

# Iterate to find fixed point

## Proposition

$$x_{FP} = \begin{cases} \frac{lc(\theta)}{1+c(\theta)} & \phi/2 < \theta < \pi/2 \\ \frac{l}{1+c(\theta)} & -\pi/2 < \theta < -\phi/2 \end{cases}$$

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

## Sketch of Proof:

Bouncing counterclockwise,  $k$  sequential edges:

$$\begin{aligned} b_\theta^k(x) &= c(\theta)(I - c(\theta)(I - \dots c(\theta)(I - x) \dots)) \\ &= \sum_{i=1}^k (-l)(-c(\theta))^i + (-c(\theta))^k x \end{aligned}$$

## Iterate for fixed point

taking the limit as  $k \rightarrow \infty$  and shifting the index gives

$$b_\theta^\infty(x) = l + \sum_{i=0}^{\infty} (-l)(-c(\theta))^i$$

And given same condition

$$|c(\theta)| = \left| \frac{\cos(\theta)}{\cos(\theta - \phi)} \right| < 1$$

this geometric sum converges:

$$b_\theta^\infty(x) = \frac{lc(\theta)}{1 + c(\theta)}$$

## General Fixed Point and Bounds on $\theta$

Solve  $|\frac{\cos(\theta)}{\cos(\theta-\phi)}| < 1$  to get bounds on  $\theta$  for guaranteeing periodic trajectories.

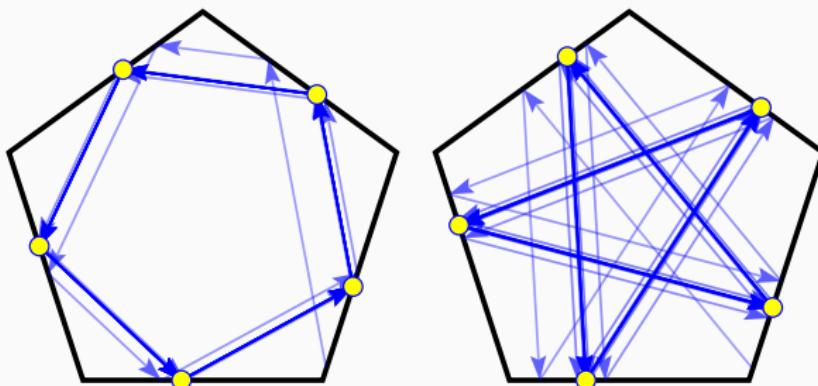
Position of collisions in limit cycle (distance from nearest clockwise vertex):

$$x_{FP} = \begin{cases} \frac{lc(\theta)}{1+c(\theta)} & \phi/2 < \theta < \pi/2 \\ \frac{l}{1+c(\theta)} & -\pi/2 < \theta < -\phi/2 \end{cases}$$

## Do the geometry and...

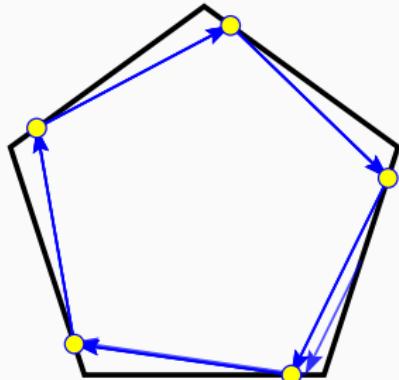
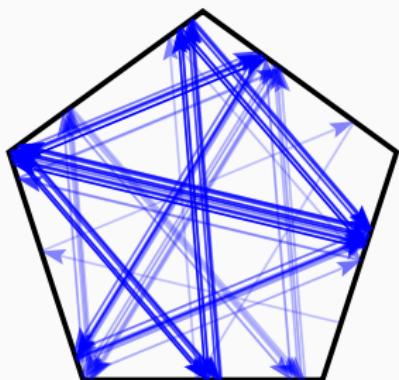
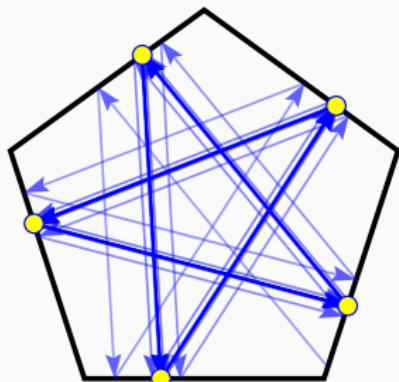
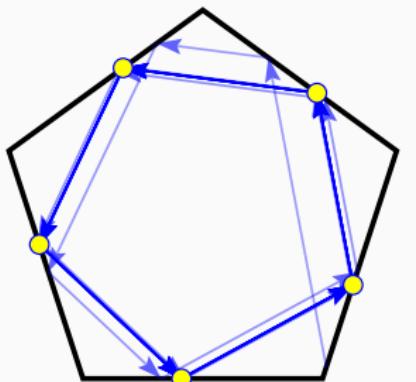
We have shown the case for clockwise bounces, on every sequential edge.

We can also imagine going counterclockwise, and skipping edges:



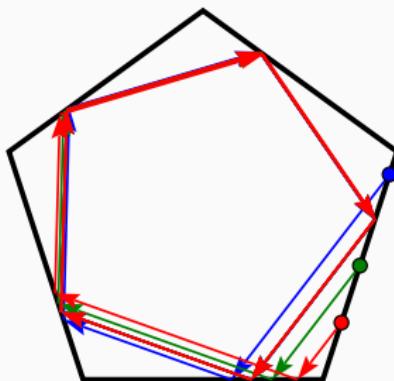
Mapping function, convergence conditions go through very similarly

## Simulation Results

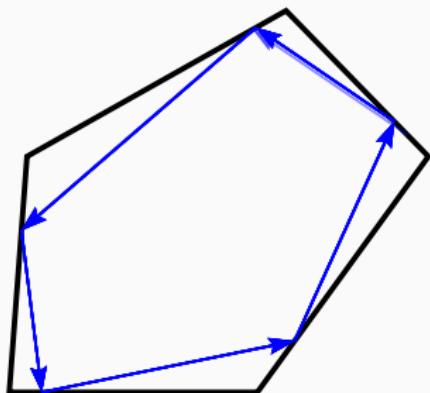


## Nice Properties

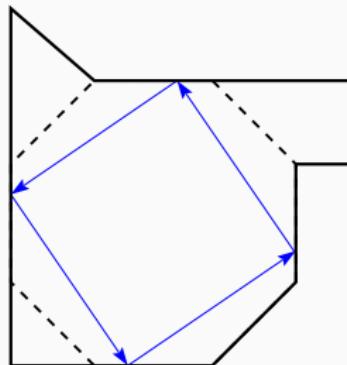
- any regular  $n$ -gon
- stable orbits are independent of starting position
- exponential convergence
- bounds on  $\theta$  from  $|c(\theta)| < 1$ : any angle in this range will make similar orbits



## Other Polygons



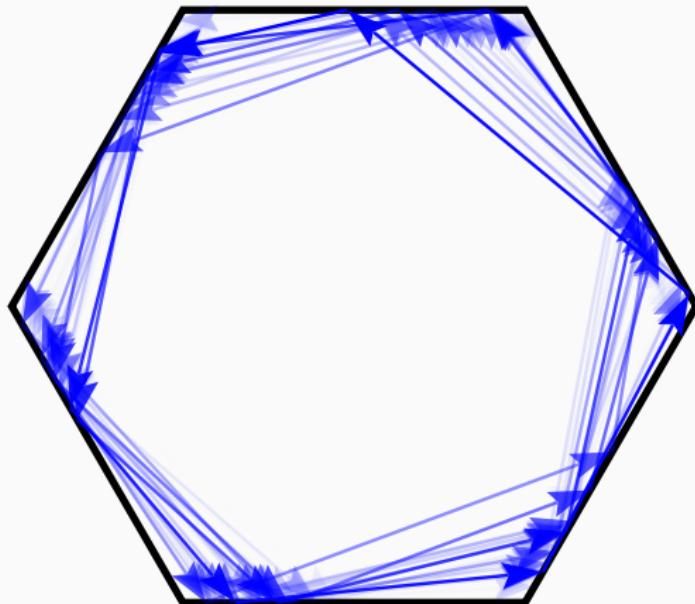
(a) A stable orbit in a sheared pentagon.



(b) A stable orbit in a nonconvex environment.

**Figure 7:** Stable orbits also exist in non-regular polygons.

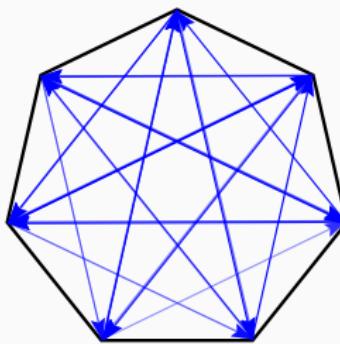
## Adding Noise



**Figure 8:** 200 bounces with uniformly distributed error added to  $\theta$ ,  $-0.1 \text{ rad} \leq \epsilon \leq 0.1 \text{ rad}$

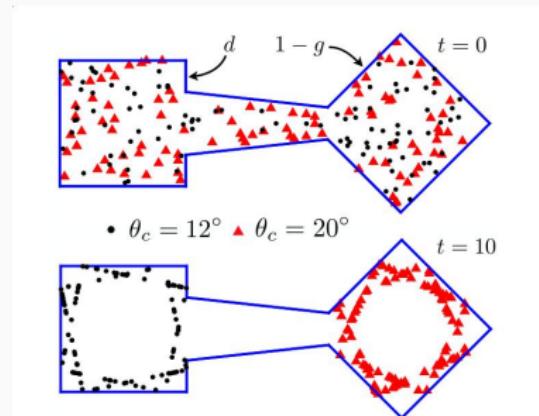
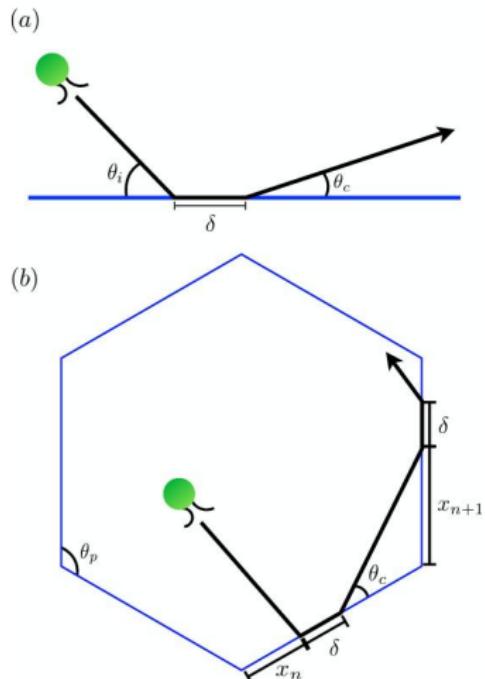
## Open Problems & Future Work

- How to characterize non-periodic dynamics?
  - frequency doubling at transition angles
  - Lyapunov exponents
- Analytic extension to non-regular polygons?
- Smooth environments?
- Error bounds?



# Microorganism Billiards (Spagnolie et al. 2017)

- Applications: sorting, driving movement of objects in environment (Di Leonardo et al. 2010)
- switch between modes; let passive dynamics evolve



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