



# Behavioral dynamics of steering and obstacle avoidance

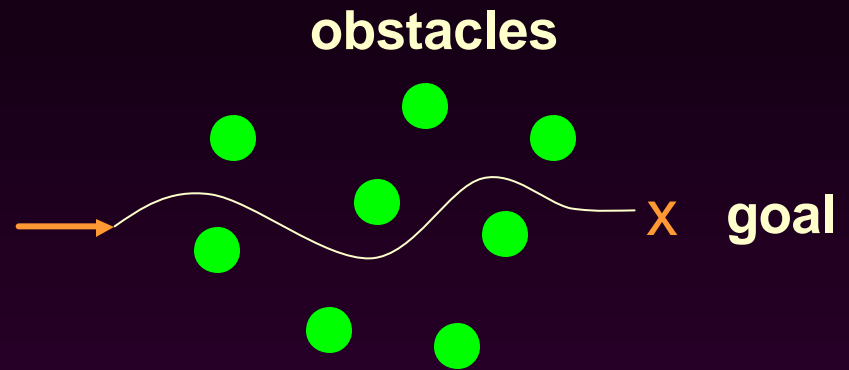
William H. Warren

Brett R. Fajen

Brown University

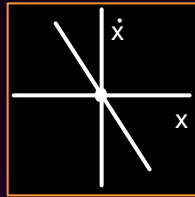
# The Problem

QuickTime™ and a  
H.263 decompressor  
are needed to see this picture.



1. How steer through a complex scene?
  - » Goals and obstacles
2. Route selection
  - » 3D model + plan
  - » Predict route from steering dynamics

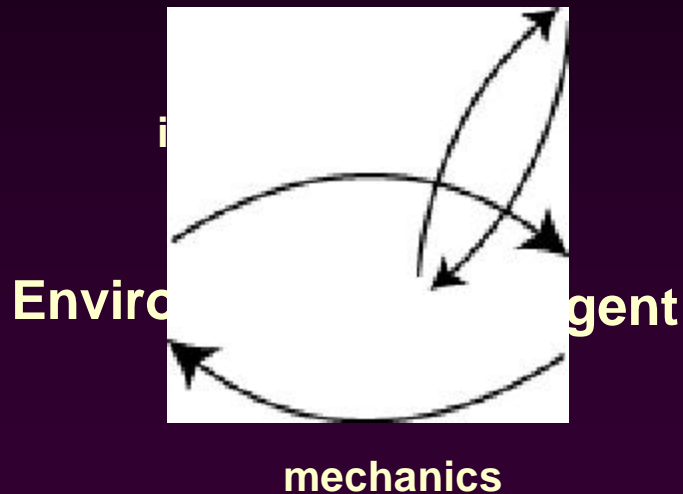
# Behavioral Dynamics



## Behavioral Dynamics

- collective variable  $x$
- attractors

$$\dot{x} = f(x)$$

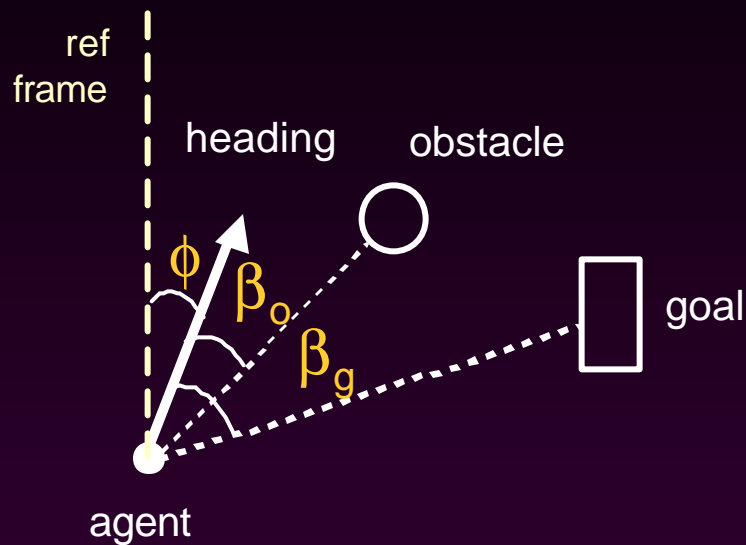


## Perception & Action

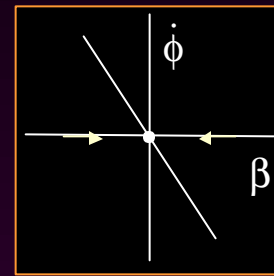
- visual control laws
- Warren, et al (*Nature Neuro*, in press)
- Zosh, Duchon & Warren (poster)

- Behavior corresponds to stable solutions (attractors) of the system's dynamics

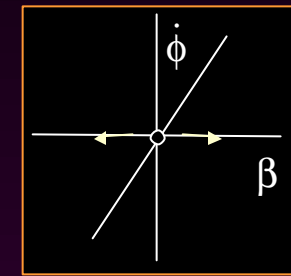
# Dynamics of steering (Schöner, Dose & Engels, 1995)



## Phase Portrait



**goal = point attractor**



**obstacle = repeller**

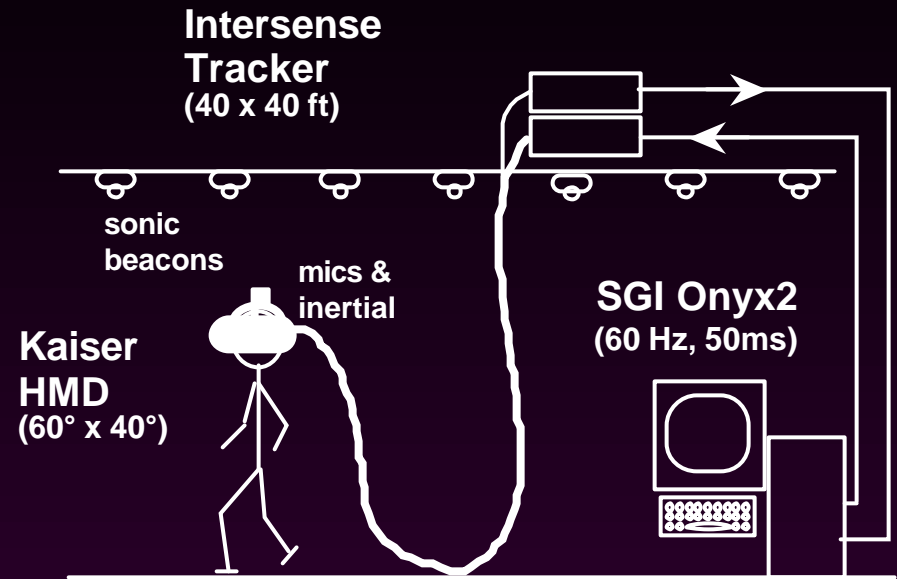
- Collective variable = heading ( $\phi$ )
- Dynamics:

$$\dot{\phi} = -k\beta$$

turn rate      heading error  
 ( $\beta$  depends on  $\phi$ )

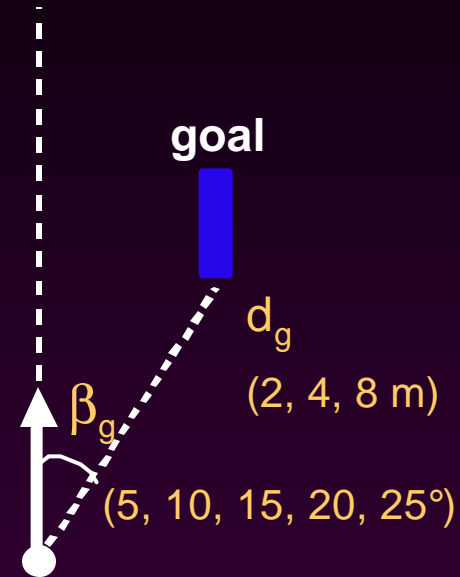
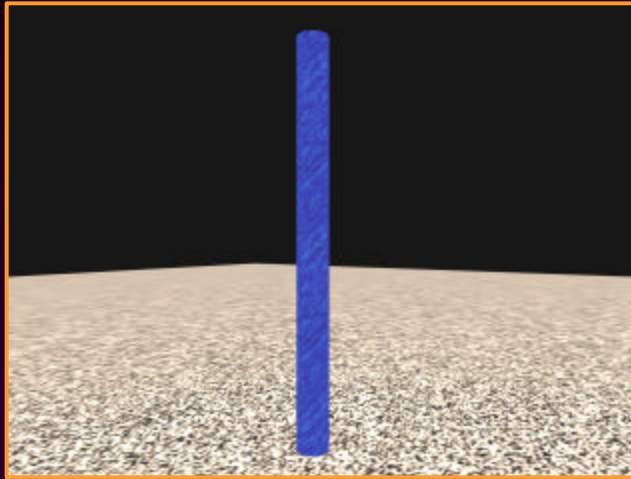
- Test goal
- Test obstacle
- Compose to predict route

# The VENLab



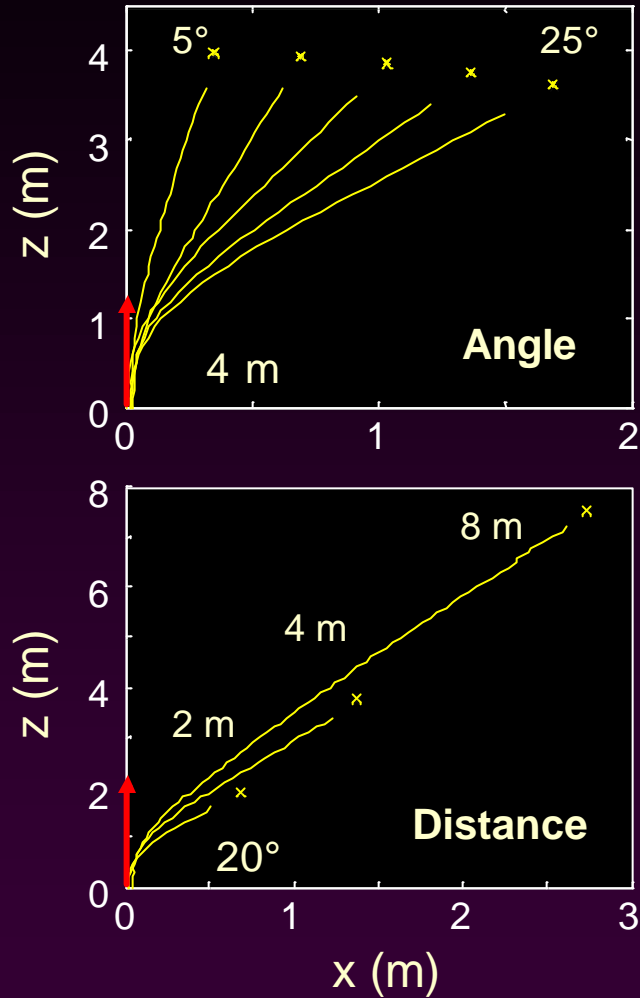
- Manipulate goals & obstacles during walking
- Record path

# Exp. 1 & 2: Walk to goal

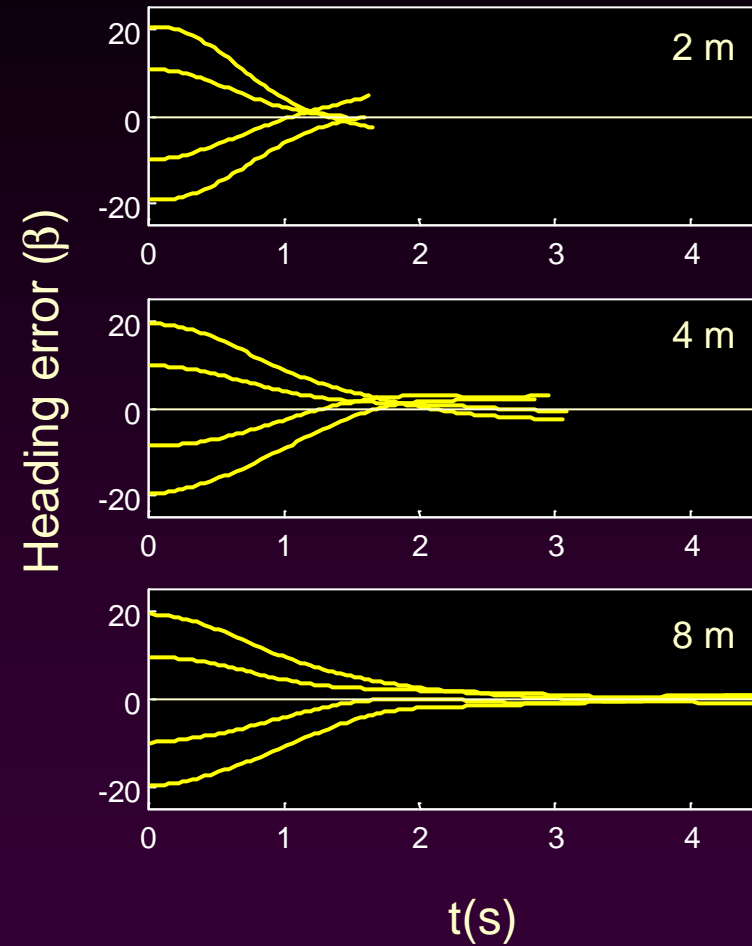


- Walk 1 m, goal appears
- Vary initial goal angle and distance
- “Walk to goal”

## Paths

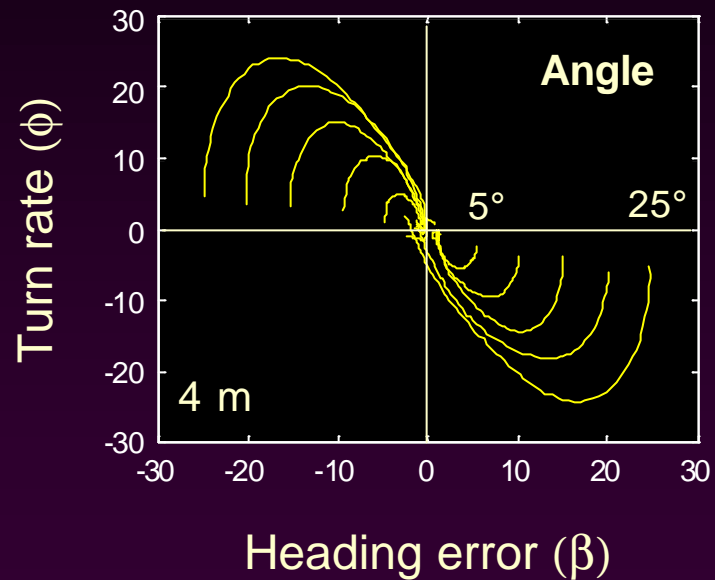


## Heading error



- Turn rate depends on goal angle and distance (or TTC)

## Phase portrait



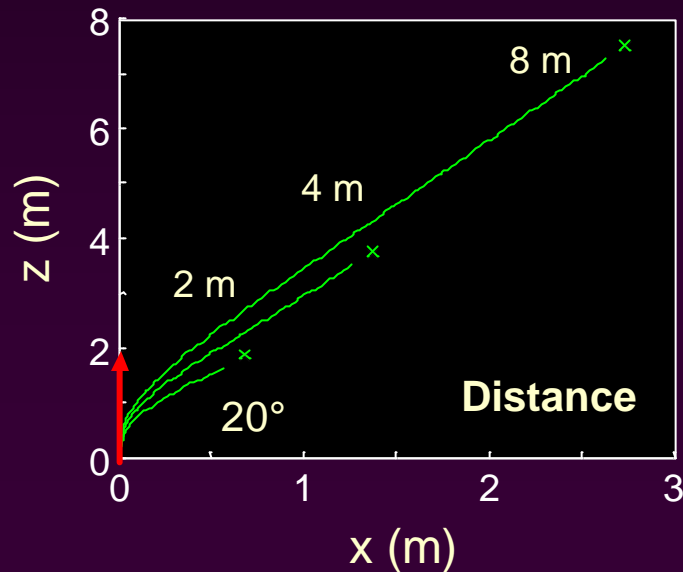
- Point attractor dynamics
- At least 2nd-order system
  - » accelerate body mass
  - » also depends on distance

# Model

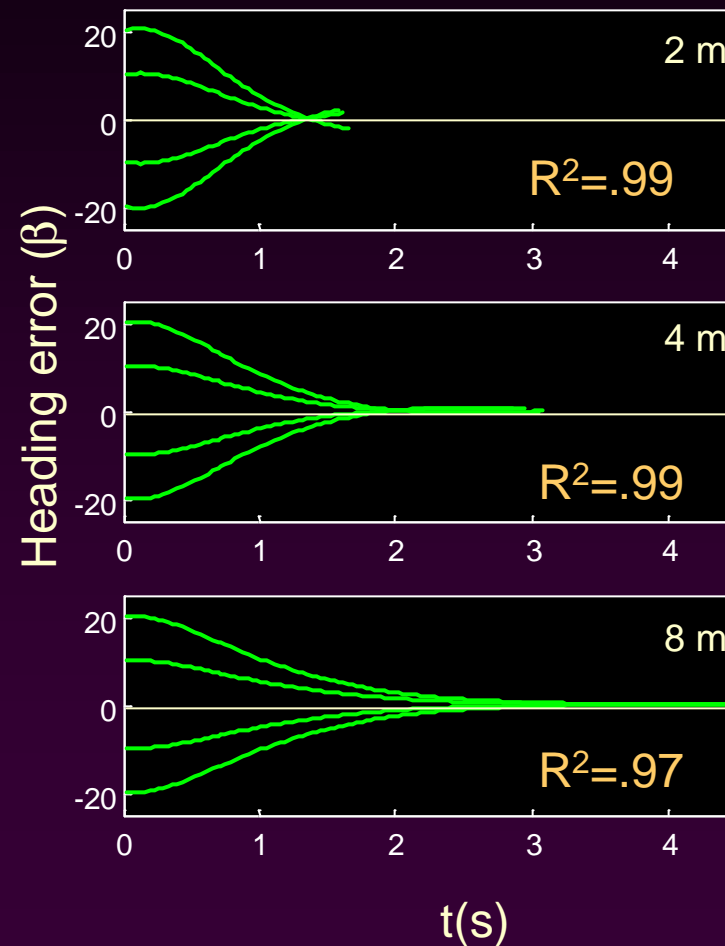
$$\ddot{Y} = -b\dot{Y} - k(b_g)(c_1 e^{-c_2 d_g} + 1)$$

- $b = 3.25$  “damping”
- $k = 3.0$  “stiffness”
- goal influence decreases exponentially w/ distance ( $d_g$ )

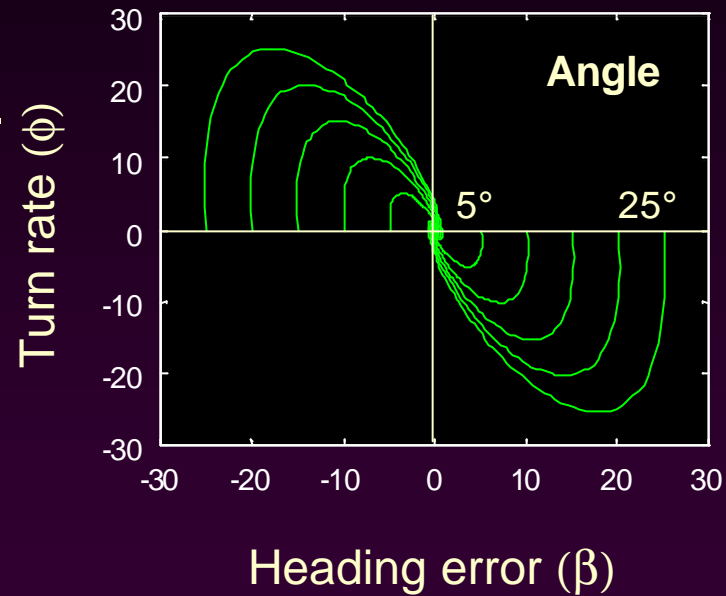
## Simulated paths



## Simulated heading error



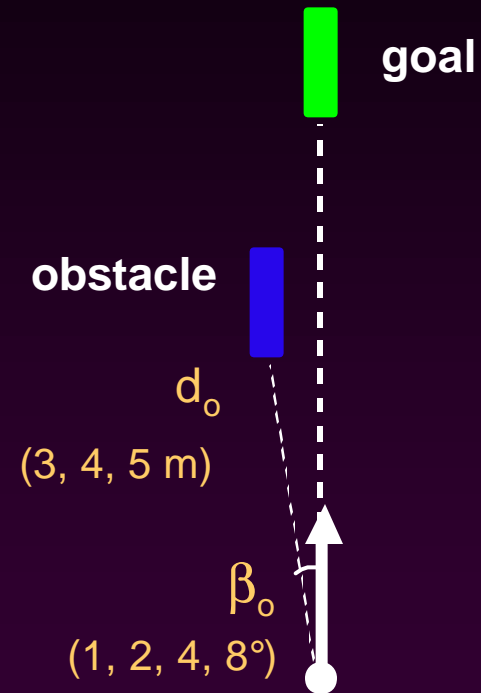
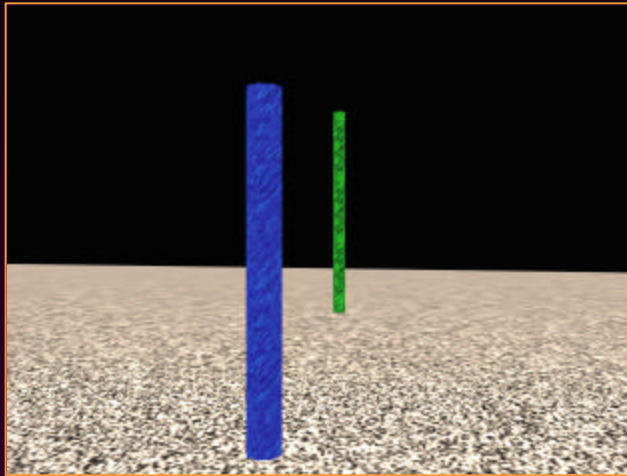
## Phase portrait simulation



### Steering to a goal:

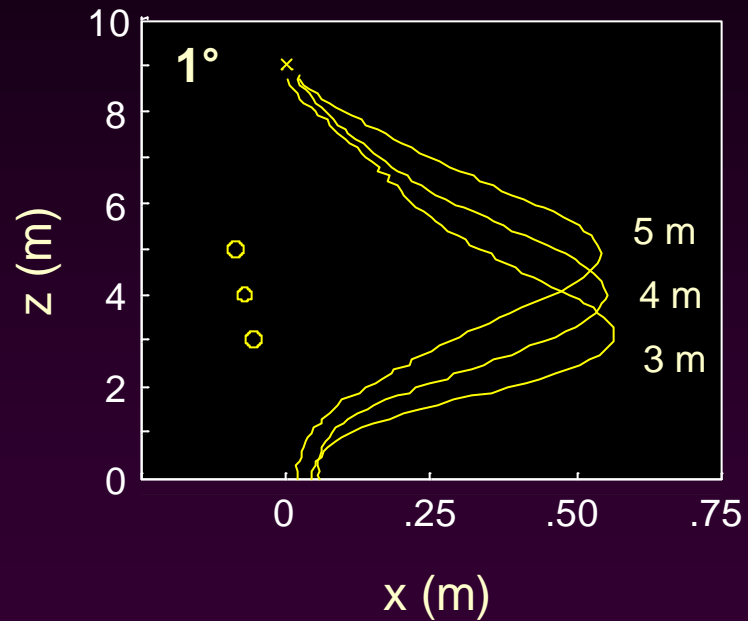
- Point-attractor dynamics
- Turn rate depends on heading error and distance (TTC)
- Dynamical model

# Exp. 3: Obstacle Avoidance

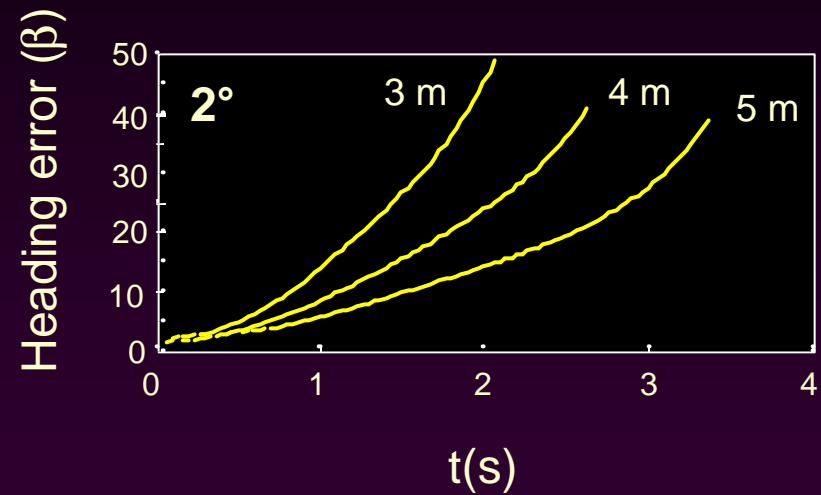


- Walk 1 m toward goal, obstacle appears
- Vary initial obstacle angle and distance
- “Walk to goal around obstacle”

## Paths



## Heading error



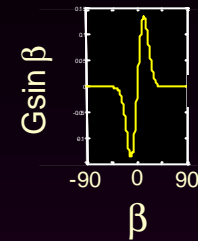
- Repellor dynamics
- Turning depends on obstacle angle and distance (TTC)

# Model

goal

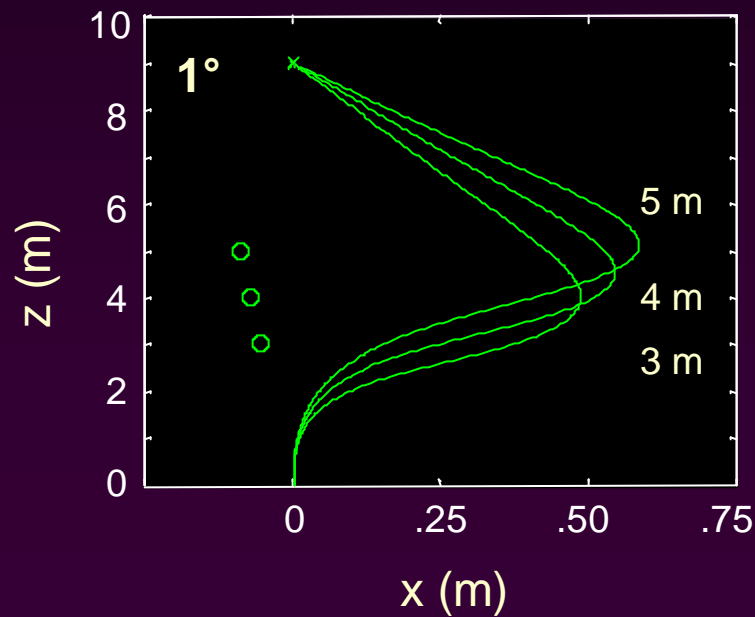
obstacle

$$\ddot{\mathbf{Y}} = -b\dot{\mathbf{Y}} - k \left\{ \mathbf{b}_g (c_1 e^{-c_2 d_g} + 1) + G \sin(\mathbf{b}_o) (c_1 e^{-c_2 d_o} + 1) \right\}$$

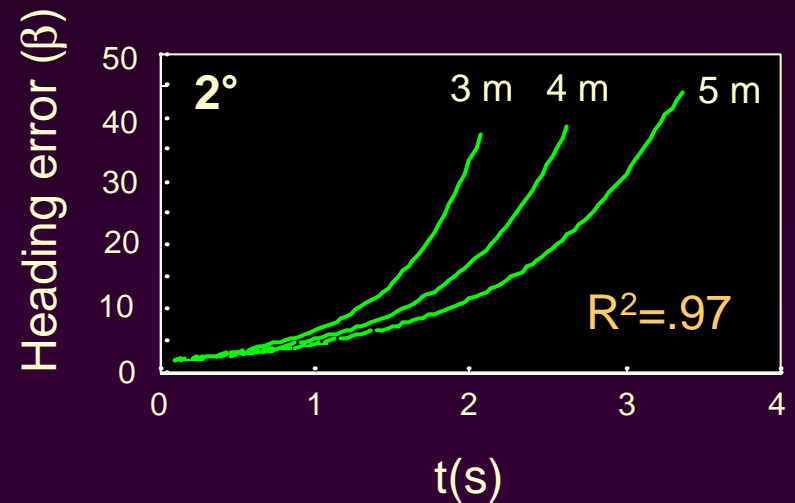


- obstacle influence decreases with angle

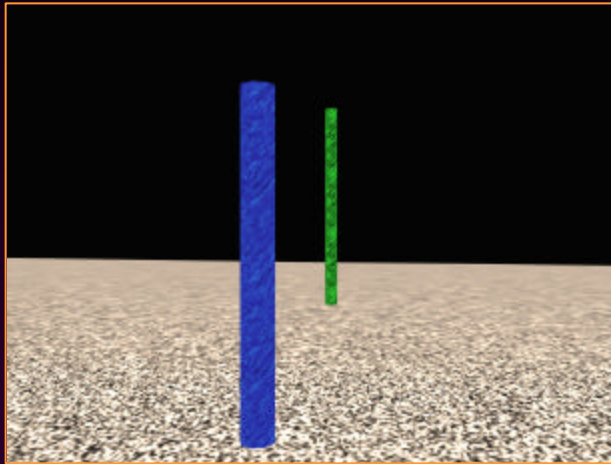
## Simulated paths



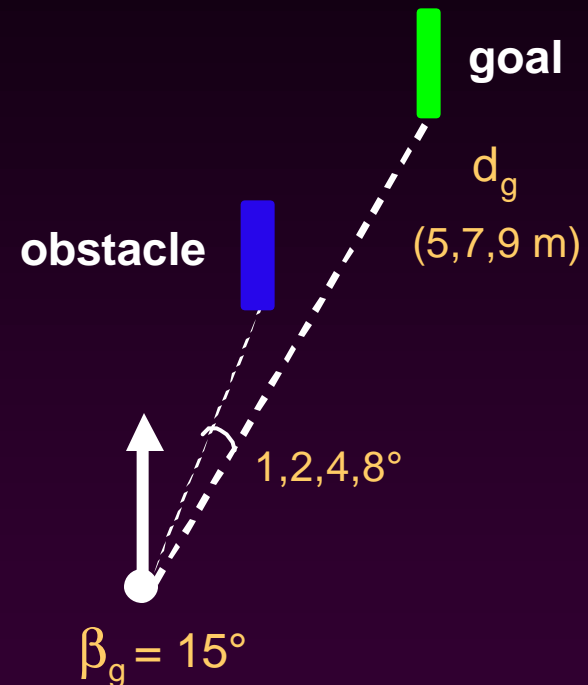
## Simulated heading error



# Exp. 4: Route selection in simple scene



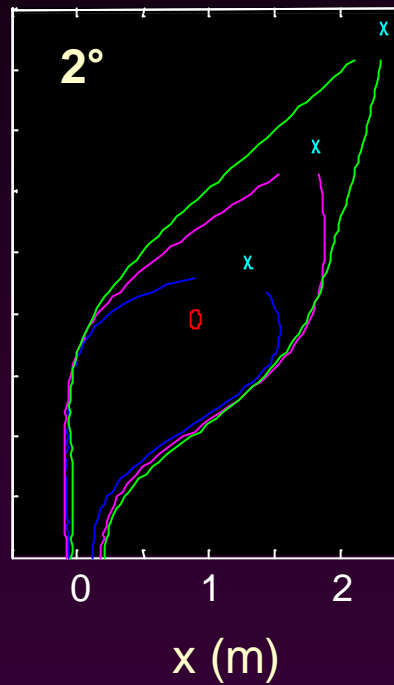
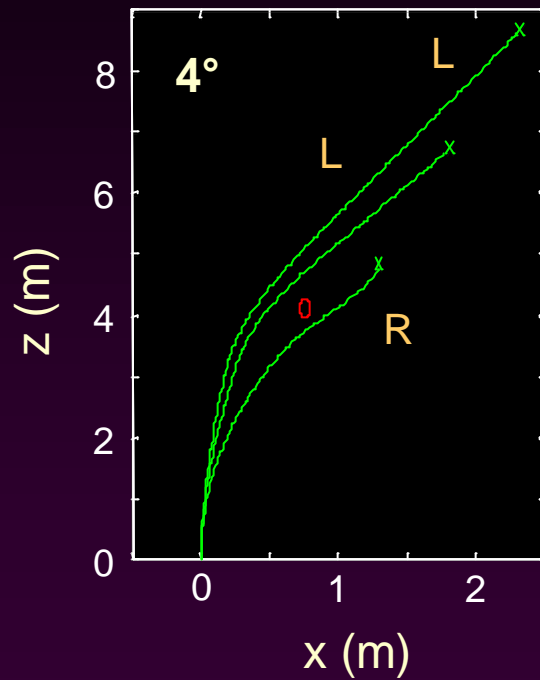
- Predict route from local steering dynamics?



- Walk 1 m, goal and obstacle appear
- Vary initial goal-obstacle angle and goal distance
- Cross R in front of obstacle?

## Model predictions

## Human paths



Trials R:

22.2%

34.8%

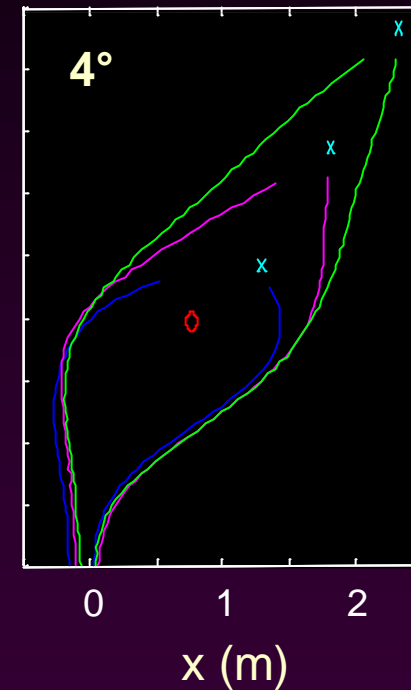
54.8%

Trials R:

56.1%

71.1%

89.8%



- Cross R in front of obstacle as goal gets closer
- Strength of attractor overcomes repellor

# Conclusions

## 1. Steering dynamics

- » Goals = point attractors
- » Obstacles = repellors
- » Depend on distance (or TTC)

## 2. Predict routes from steering dynamics

- » Compose terms for goals and obstacles
  - » Image-based, on-line
  - » vs. model + plan
- Next: generalize to route selection in complex scenes

