



**BRADLEY**  
University

**COOPERATIVE CONTROL OF  
HETEROGENEOUS MOBILE  
ROBOTS NETWORK**

Gregory Bock, Brittany Dhall, Ryan Hendrickson, & Jared Lamkin

**Project Advisors:** Dr. Jing Wang & Dr. In Soo Ahn

Department of Electrical and Computer Engineering

April 26<sup>th</sup>, 2016

# Outline

- I. Introduction
- II. E-puck – Brittany
- III. Kilobot - Jared
- IV. QBot 2 – Ryan & Greg
- V. Summary & Conclusions

# I. Introduction

# Objectives

- Design and Experimental Validation of Cooperative Control Algorithms
  - Sensing/communication between robots
  - Implementation of local flocking control algorithms
  - Implementation of local formation control algorithms

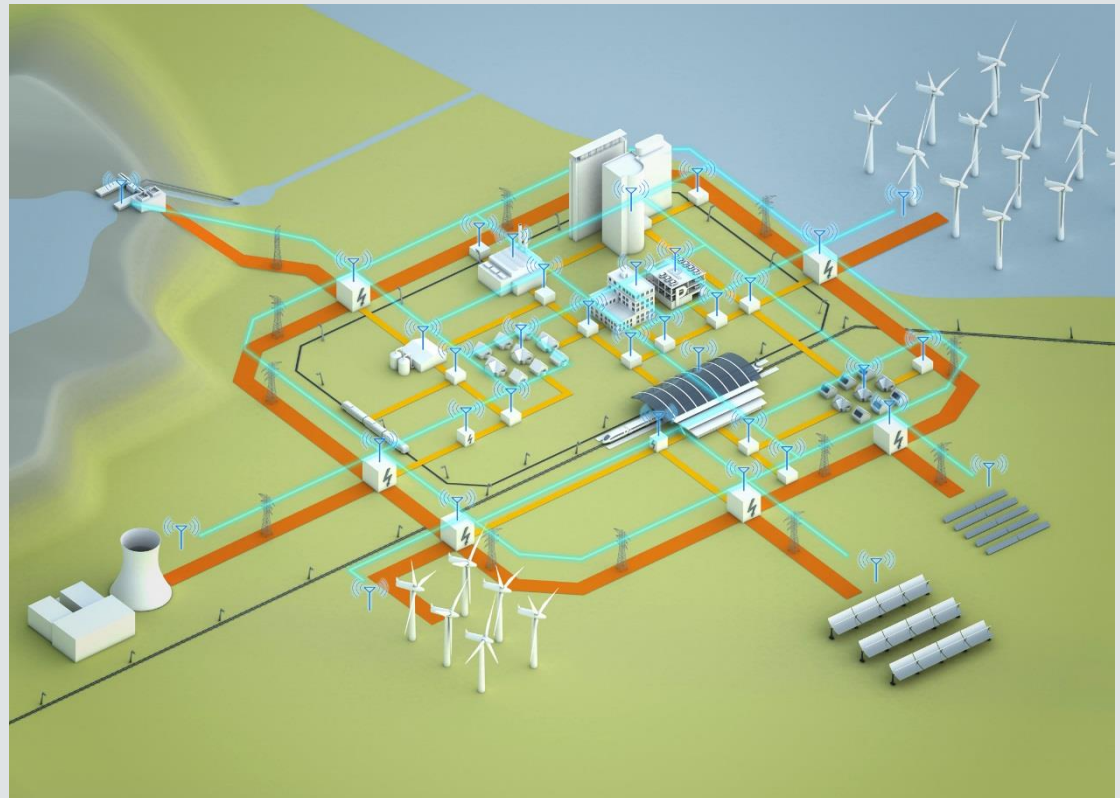
# Project Background

- Cooperative systems found in nature
  - Flock of birds
  - School of fish
  - Swarm of insects

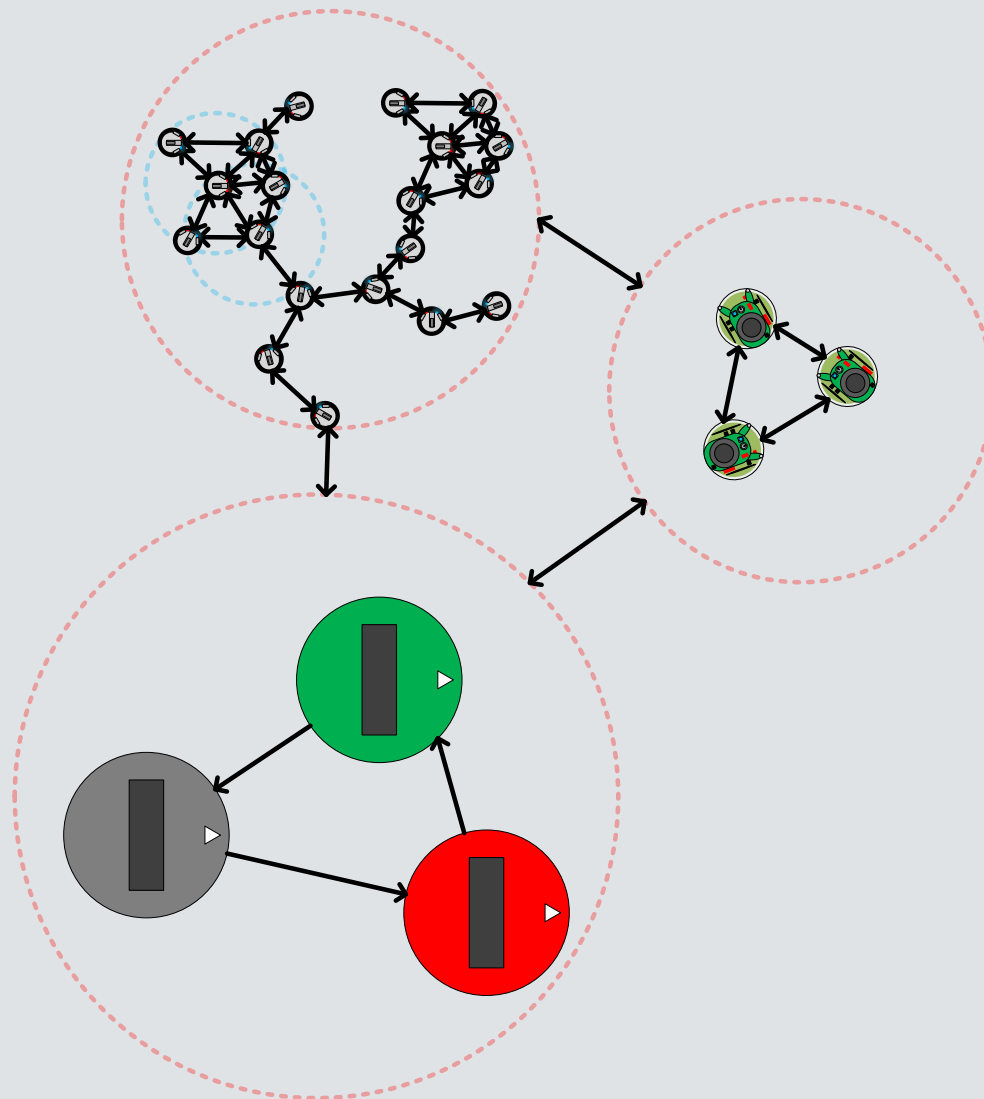


# Possible Applications

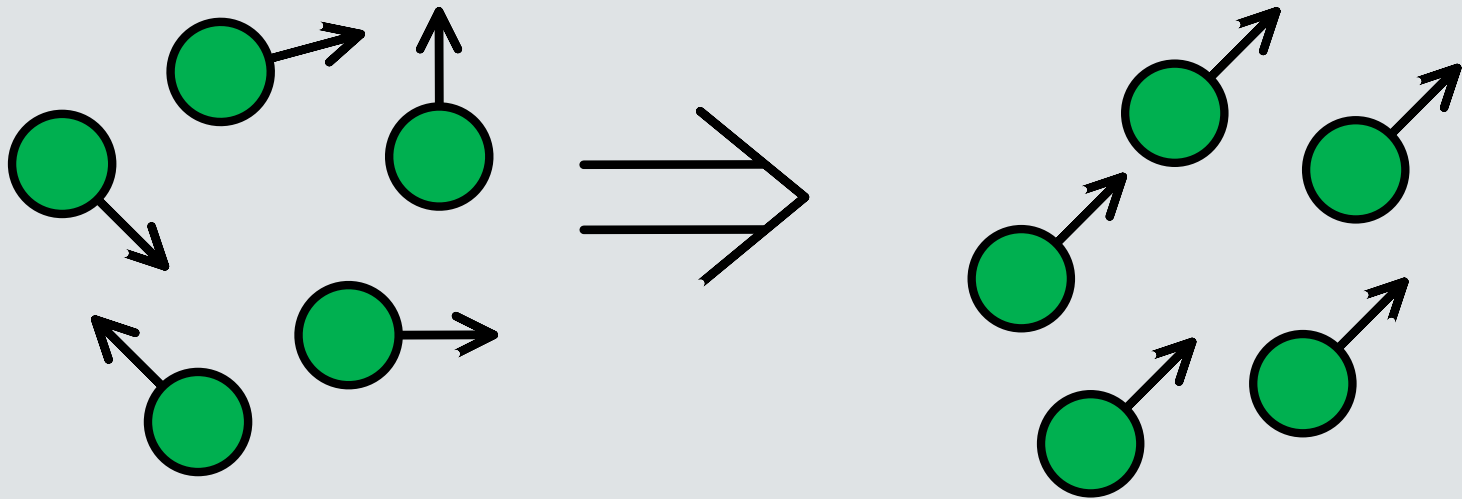
- Cooperative systems found in engineering
  - Smart Grid
  - Sensor Network
  - Traffic Network



# Heterogeneous Groups

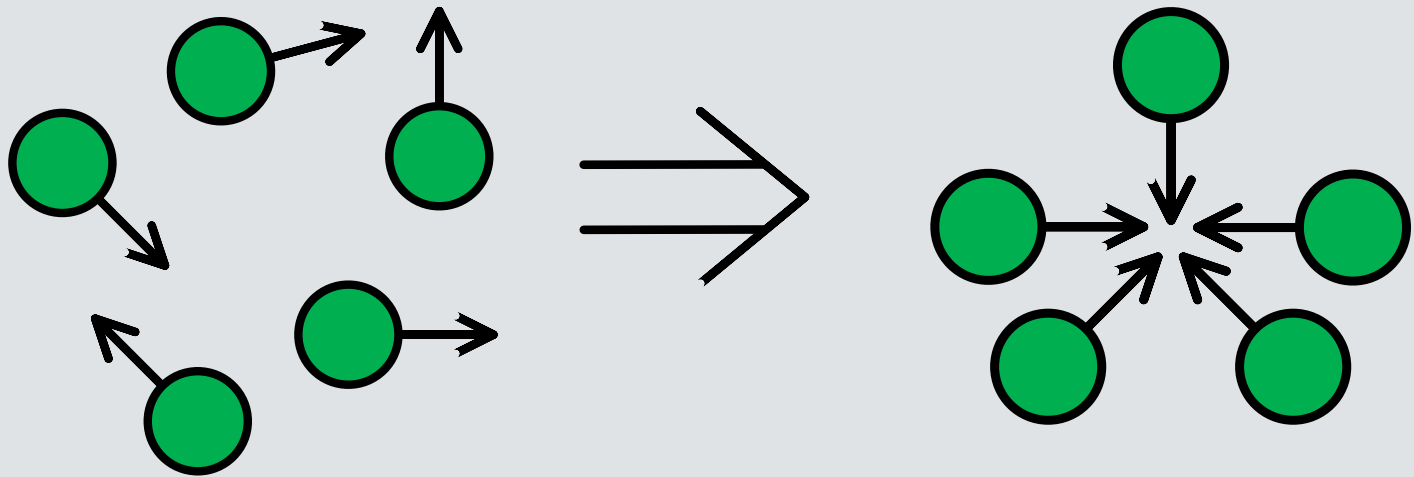


# Heading Alignment

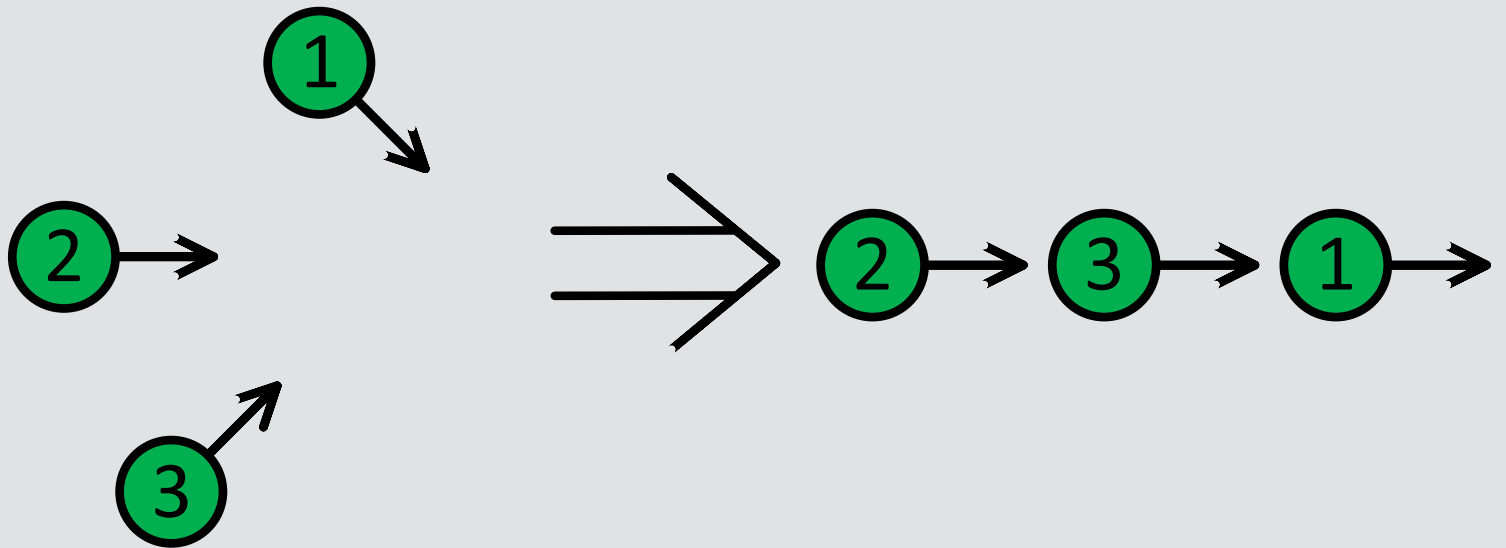




# Point Consensus



# Following



# Design Constraints

- Must overcome limited communication among networked robots
- Must overcome limited sensing capability of robots
- Must overcome system uncertainties

# Test Platform – Kilobot

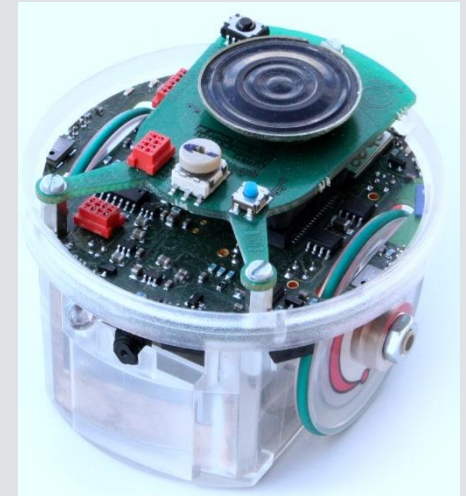
12

- Diameter of 3.3 cm
- Two differential vibration motors
- IR transmitter and receiver (7 cm range)
- Ambient light sensor



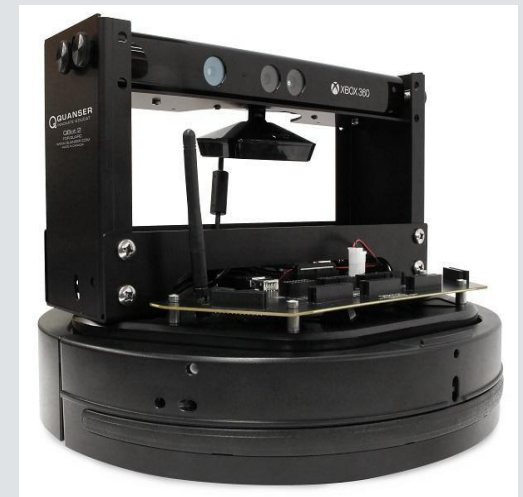
# Test Platform – E-puck

- Diameter of 7 cm
- IR transmitter and receiver ring (25 cm range)
- On-board CMOS camera
- Bluetooth 2.0
- dsPIC 30F6014A on-board computer



# Test Platform – QBot 2

- Open-architecture autonomous ground robot
- Xbox 360 Kinect
- Kobuki robot base
- Gumstix DouVero Zephyr on-board computer



## II. E-puck – Brittany

# Work Accomplished

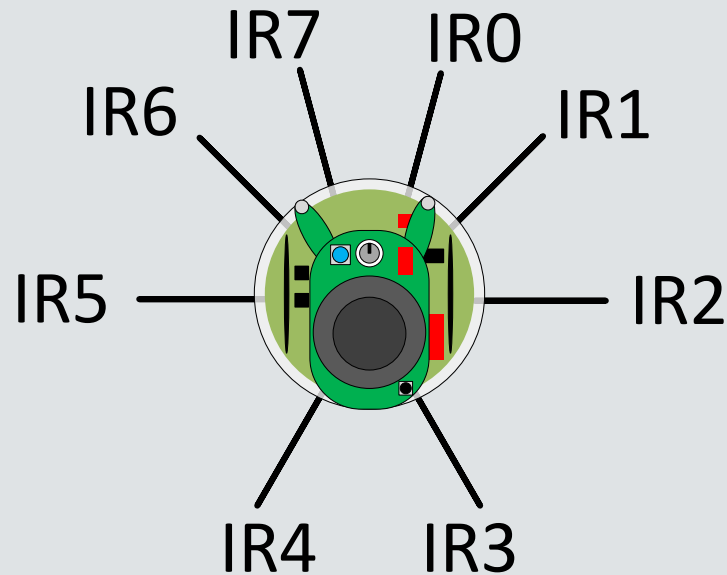
- Software & hardware implementation
- Object detection/following
- Odometry
- Vicsek Model
- Fix battery issues





# Infrared proximity sensors

- 8 infrared proximity sensors
  - Composed of two parts -IR emitter & photo-sensor
- Can detect objects within 4 centimeters



# Object Detection and Following

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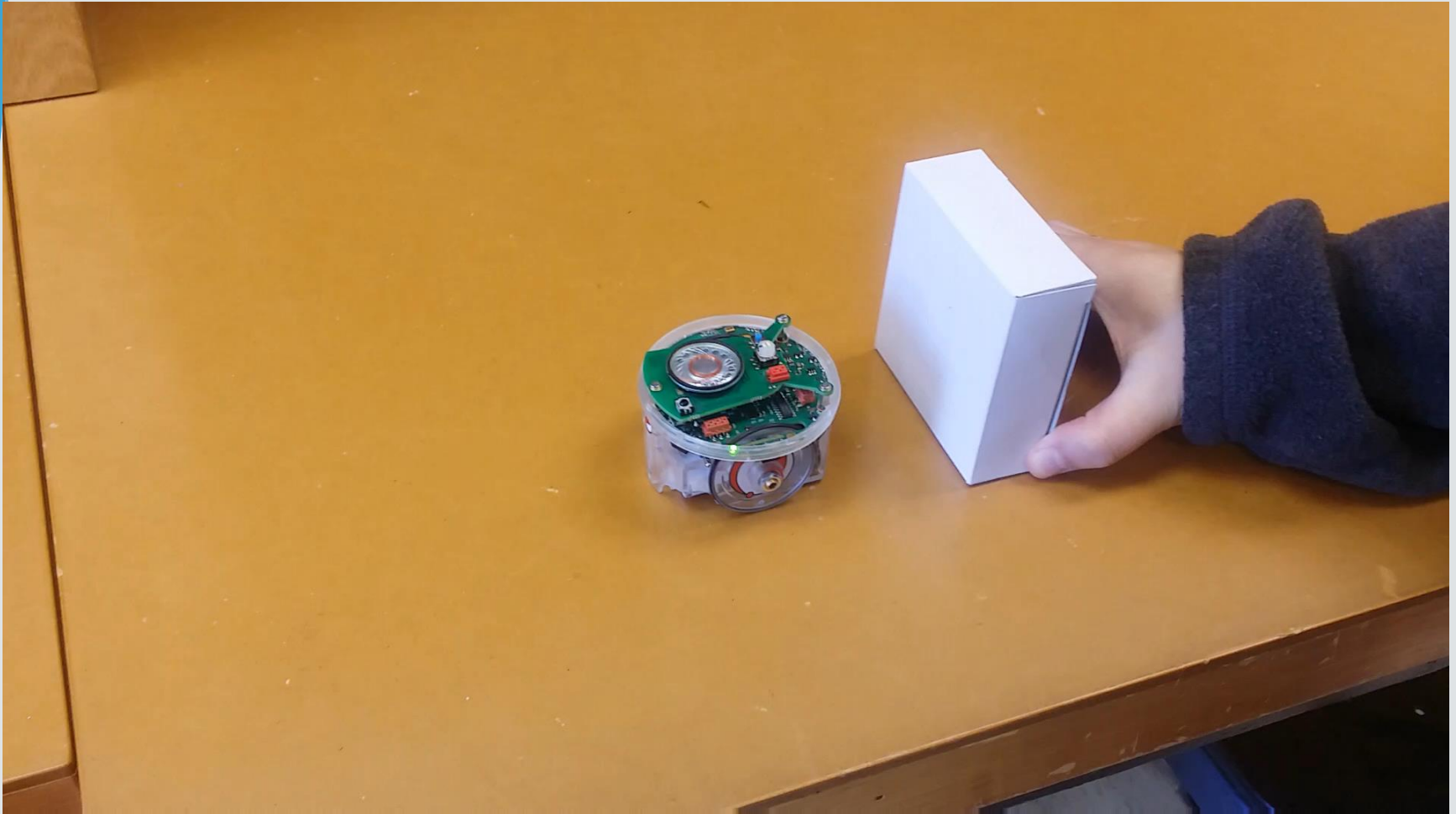
- Proximity sensors -> detected distance
- Compare with true specified distance
- Velocity = gain\*(specified distance – detected distance)

# Object Detection



# Object Following

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# Odometry

- Using odometry the E-puck can compute their position and orientation

$$\Delta x = \Delta S * \cos \left( \theta(k) + \frac{\Delta \theta}{2} \right)$$

$$\Delta y = \Delta S * \sin \left( \theta(k) + \frac{\Delta \theta}{2} \right)$$

$$\theta(k + 1) = \theta(k) + \frac{\Delta \theta}{3}$$

- $\Delta S$  – average change in steps of both left and right motors
- $\Delta \theta$  – change in the angle of the agents heading

# Vicsek Model

$$\theta_i(k + 1) = \frac{\theta_i(k) + \sum_{j=1}^n \theta_j(k)}{n + 1}$$

- $\theta_i(k + 1)$  - Next heading of agent
- $\theta_i(k)$  - current heading of agent
- $\sum_{j=1}^n \theta_j(k)$  - sum of all neighboring agents at time k
- n - number of neighboring agents

# Vicsek Model



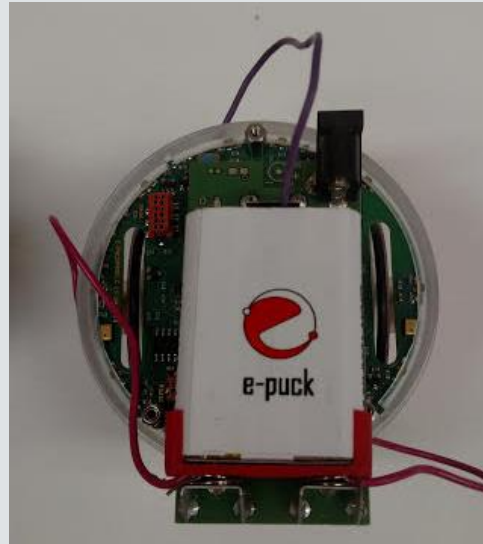
# E-puck Battery Problem – Solution

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Original Design

- Bad connection between positive and negative terminals from battery to E-puck



Solution #1

- Added an addition on top of E-puck, for better connection to terminals



Solution #2

- Resoldered positive terminal

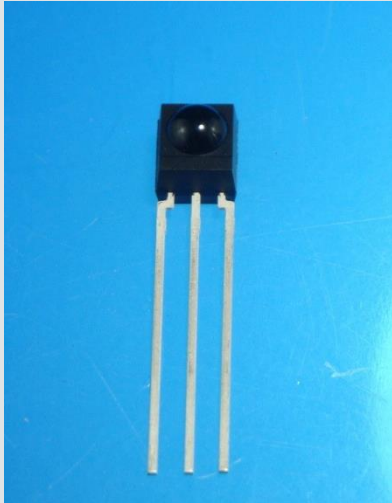


# Testing communication between E-puck and Kilobot

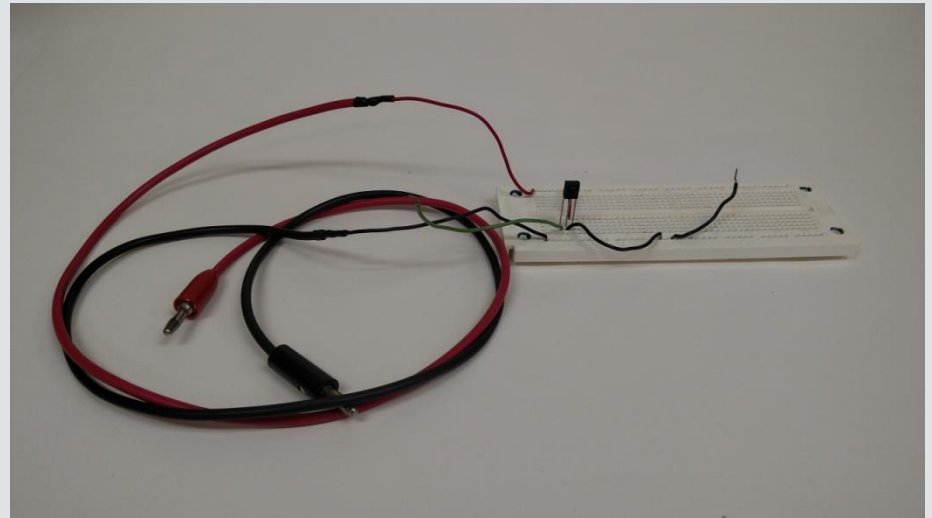
- Tested E-puck communications with infrared receiver connected to oscilloscope initially, followed by testing with Kilobot
- Verified E-pucks sent message with correct protocol
- Verification of communication between E-puck and Kilobot would be accomplished by observing change in LED from red to green

# Infrared Receiver Circuit

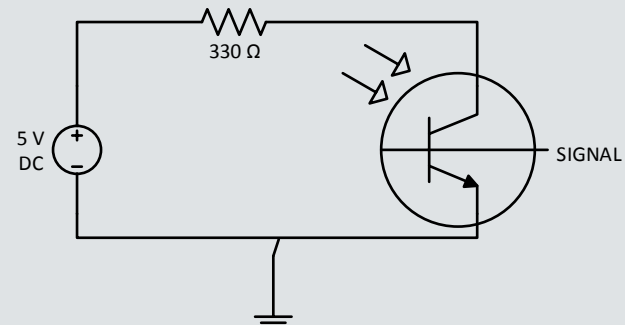
38kHz Infrared Receiver Module



Infrared Receiver Circuit



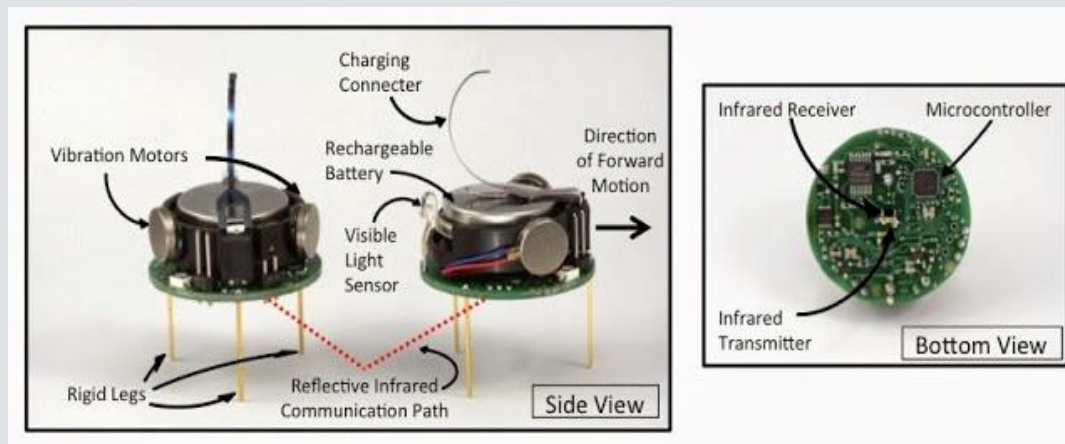
Used a 5V supply & oscilloscope to view the signals



## III. Kilobot - Jared

# Kilobot

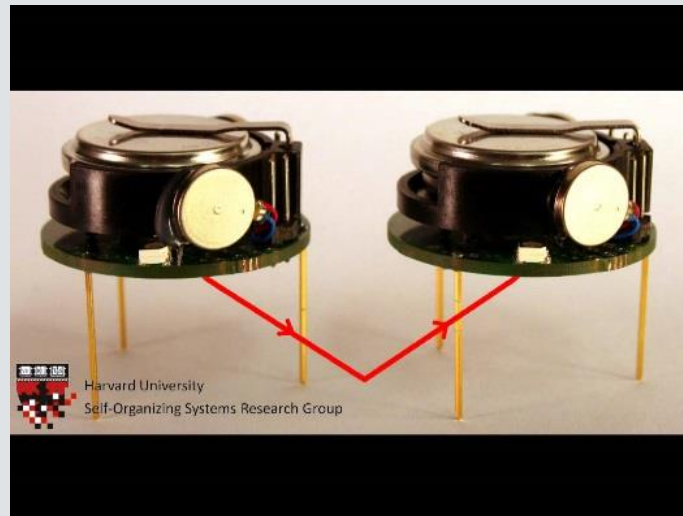
- Atmega 328 (8-bit @ 8 MHz)
- 32kB flash, 1kB EEPROM, 2kB SRAM
- 2 vibration motors
- IR LED and receiver
- Ambient light sensor



# How Kilobots Communicate

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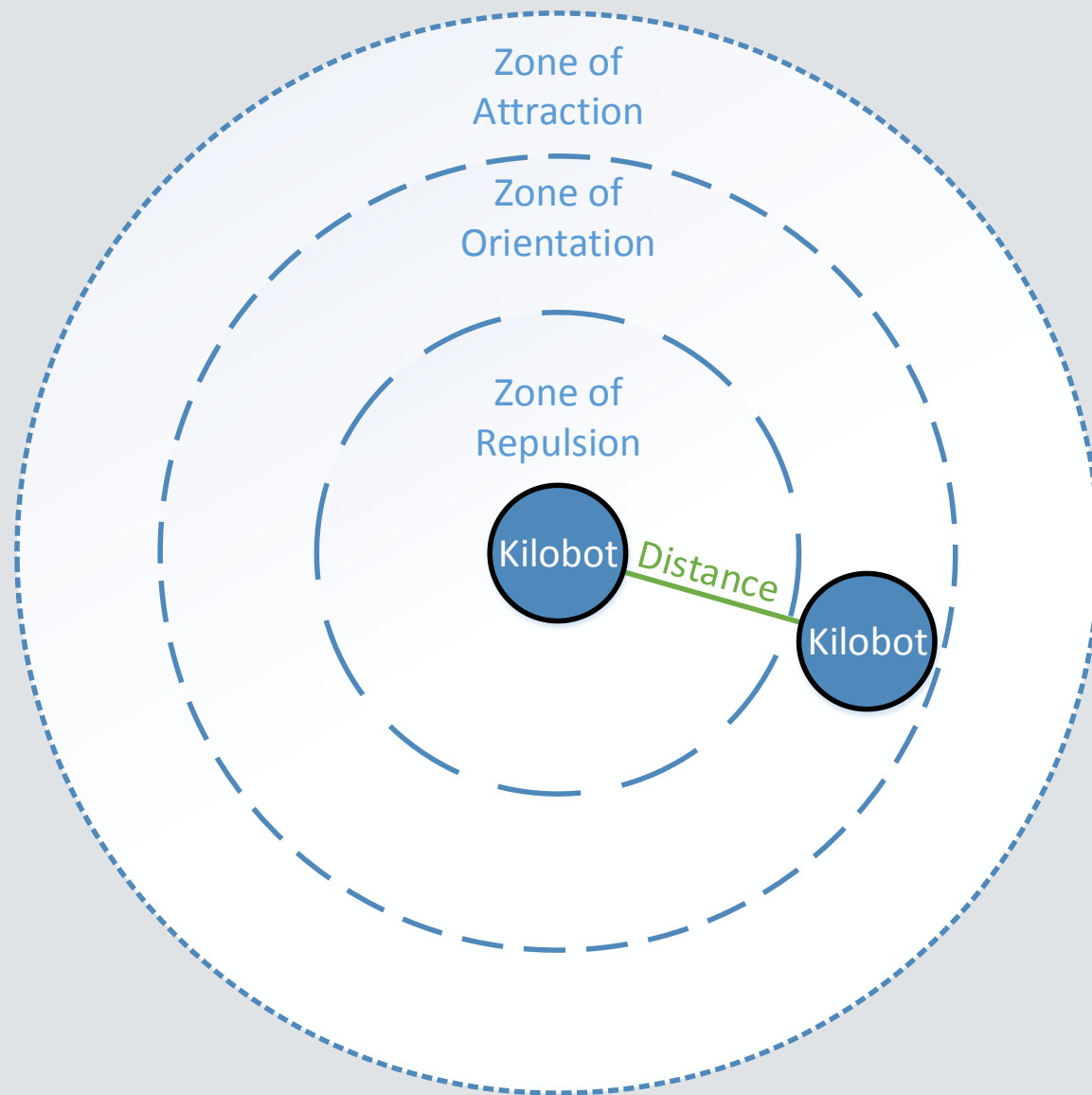
- Use infrared light
- Measures light intensity to calculate distance
- Messages are sent every 200 milliseconds



# Color Synchronization Video



# Kilobot Movement: Orbiting



# Multiple Agent Orbiting

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# Simple Localization: Gradient

- Can determine how many agents are displaced from a specified agent
- Individuals receive gradient values from local agents until a buffer is full
- Smallest value in buffer is incremented by 1, which becomes agent's gradient value

# Gradient

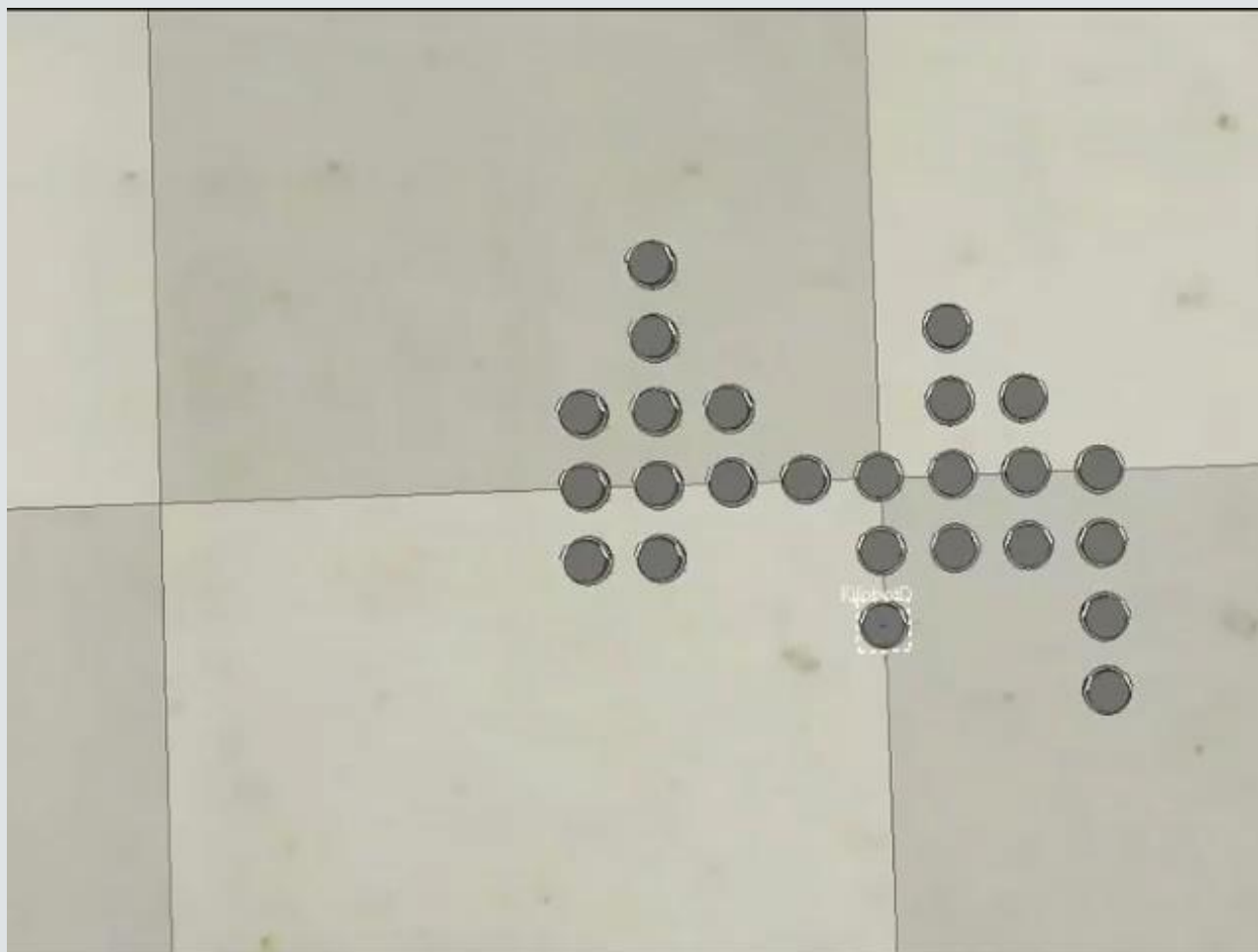


- By combining gradient, orbiting, and/or light detection more advanced behaviors can be achieved such as:
- **Fixed-point consensus**: Kilobots converge to a fixed-point
- **Edge following**: Kilobots orbit multiple stationary agents
- **Follow-the-leader**

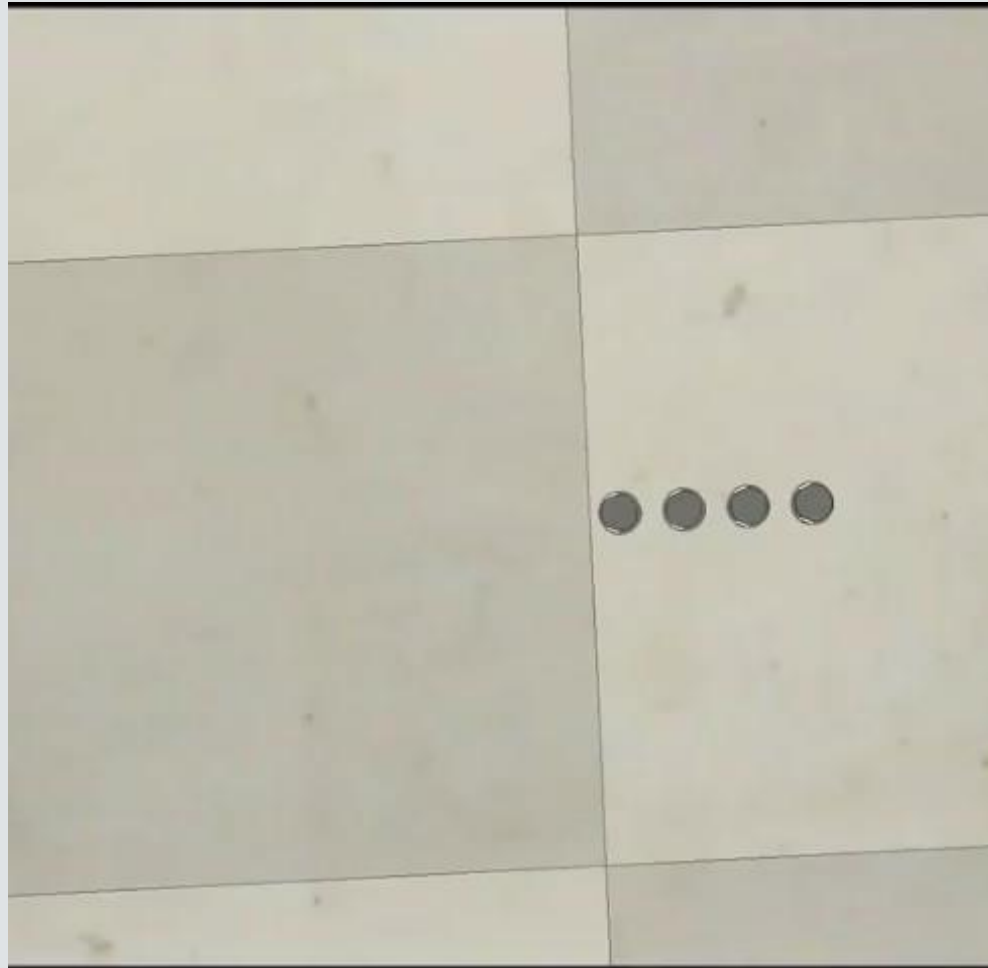
# Fixed-Point Consensus



# Edge-Following



# Follow-the-Leader



## III. QBot 2 – Ryan & Greg

# QBot 2 - Ryan



# Non-linear Model

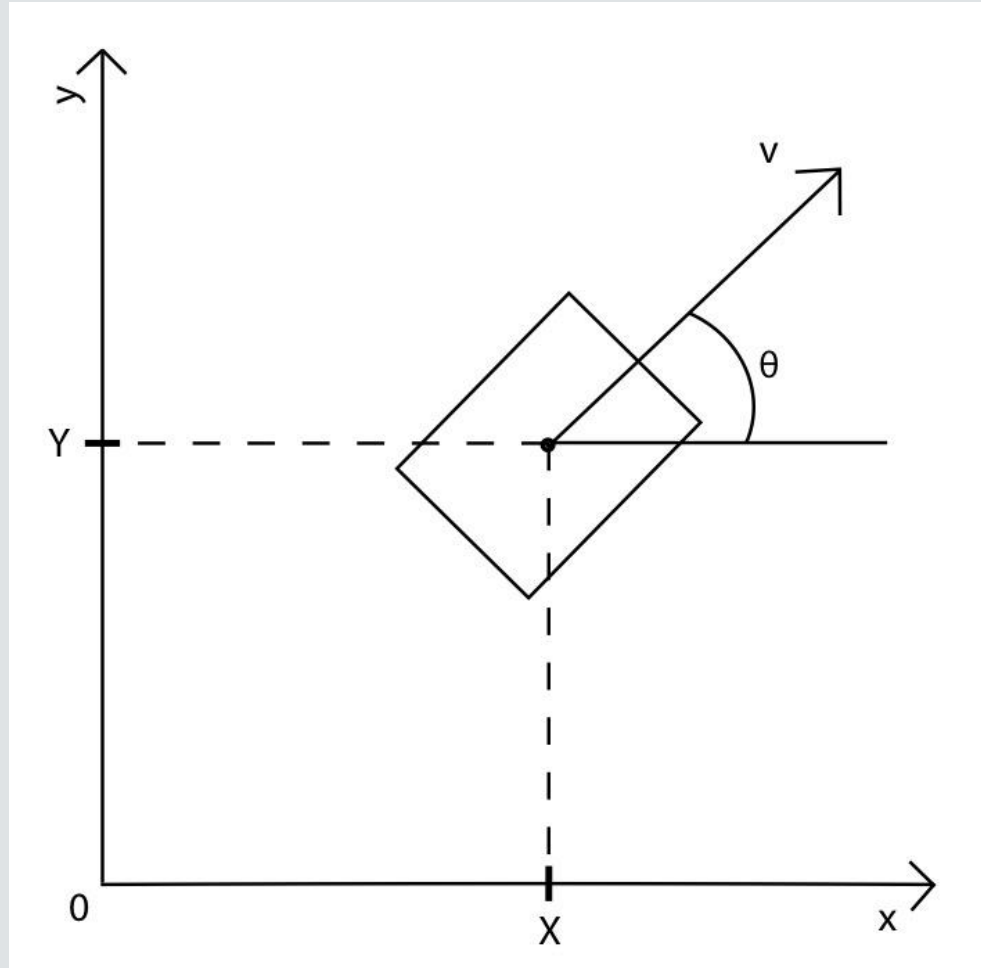
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- Non-linear Model

- $\dot{x} = v \cos(\theta)$

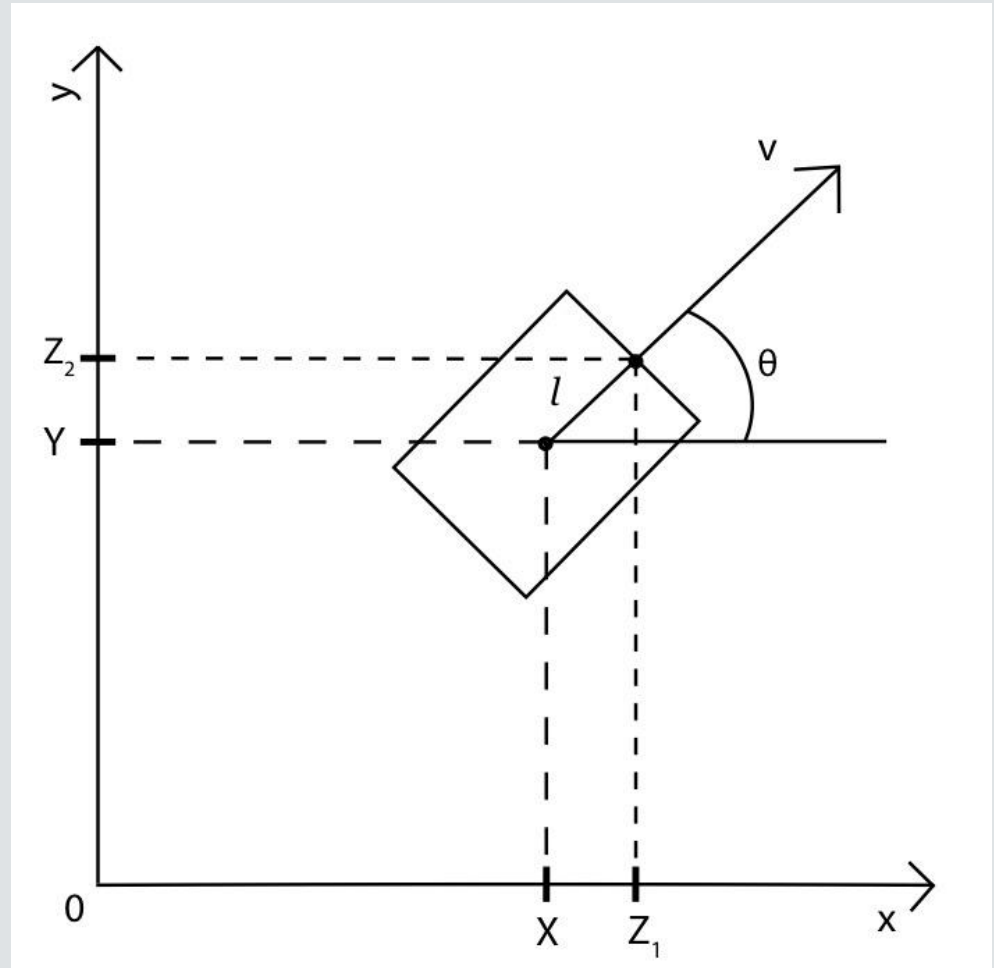
- $\dot{y} = v \sin(\theta)$

- $\dot{\theta} = \omega$

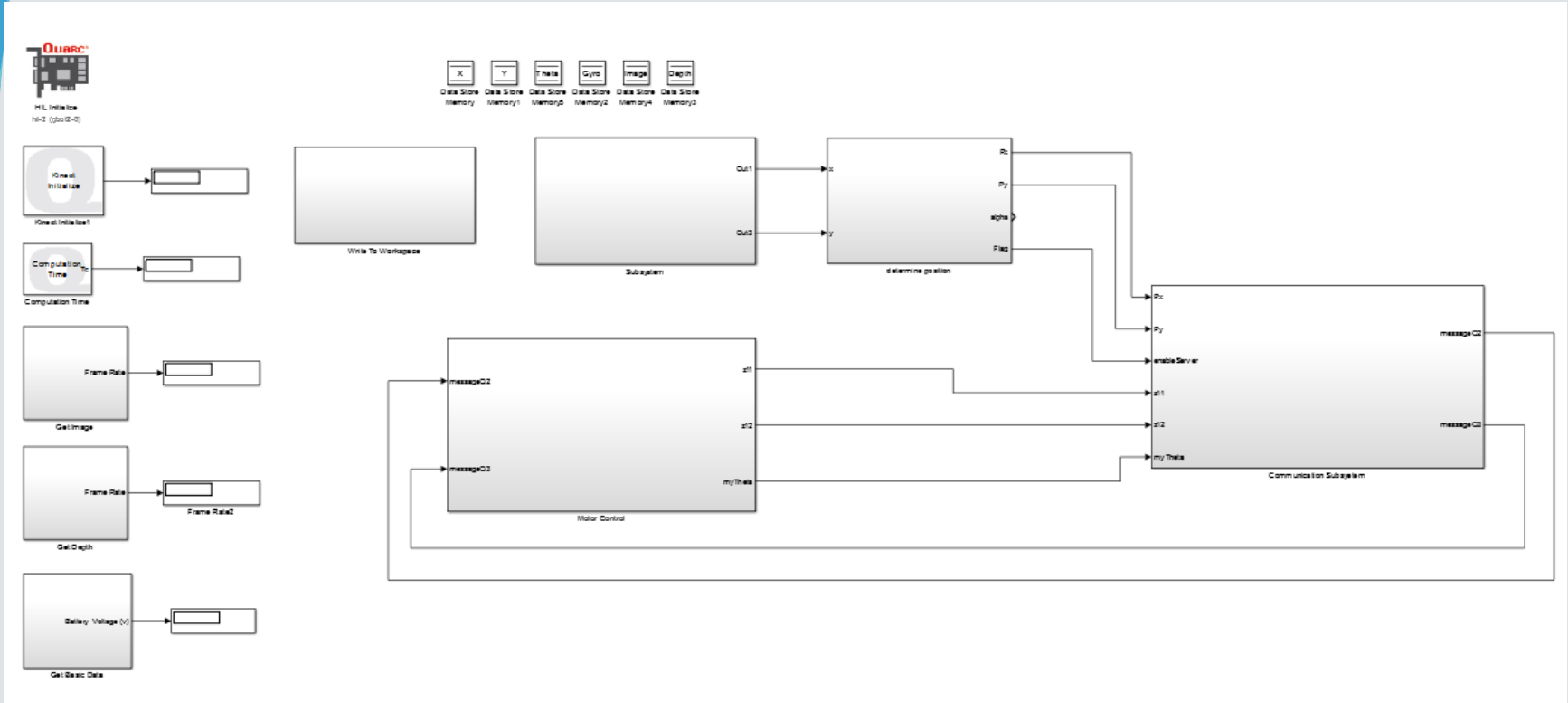


# Linear Model

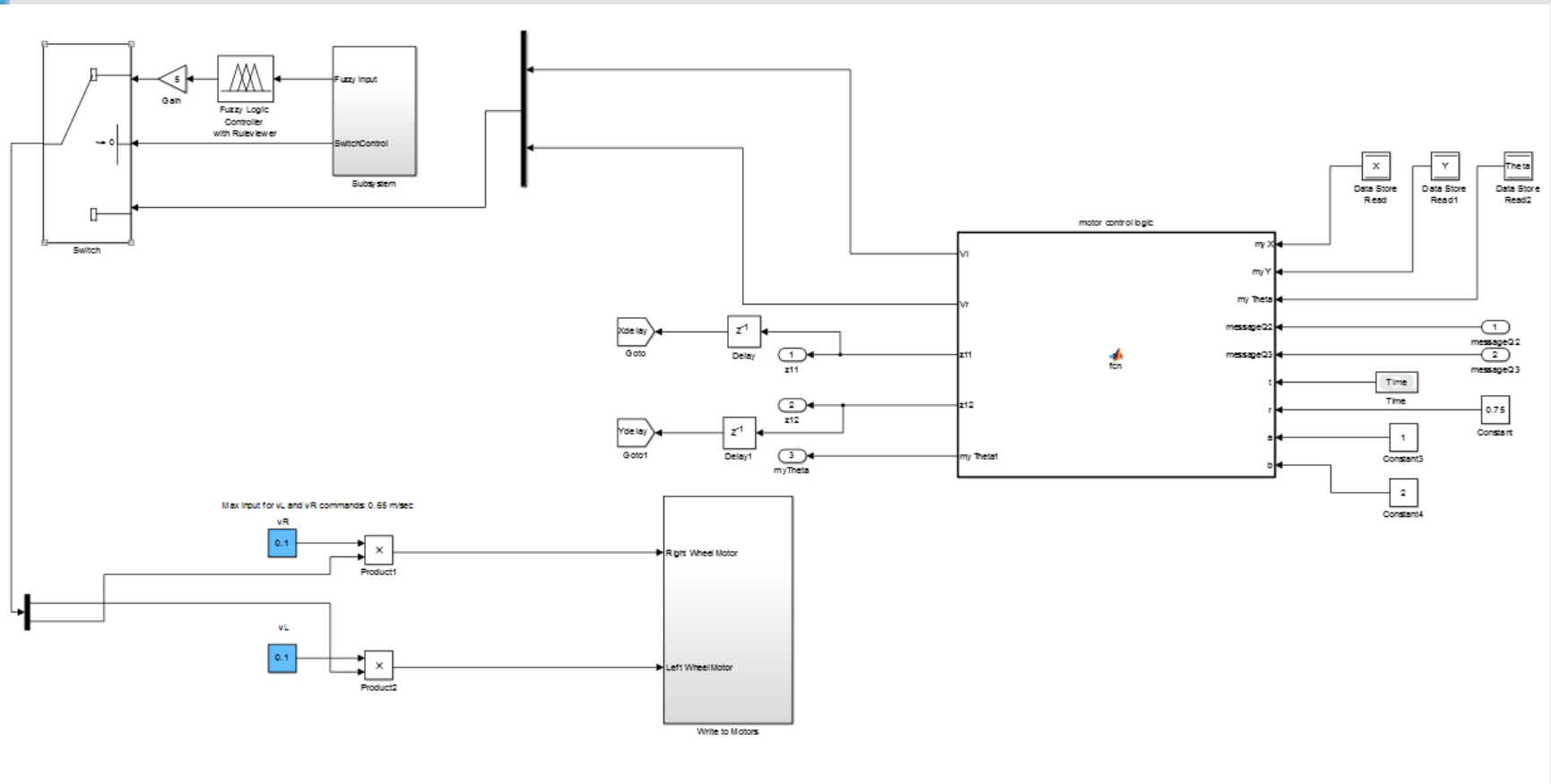
- Linear Model
  - $\dot{p}_x = u_x$
  - $\dot{p}_y = u_y$
  - $p_x = x + l * \cos\theta$
  - $p_y = y + l * \sin\theta$



# Simulink Model



# Simulink Model

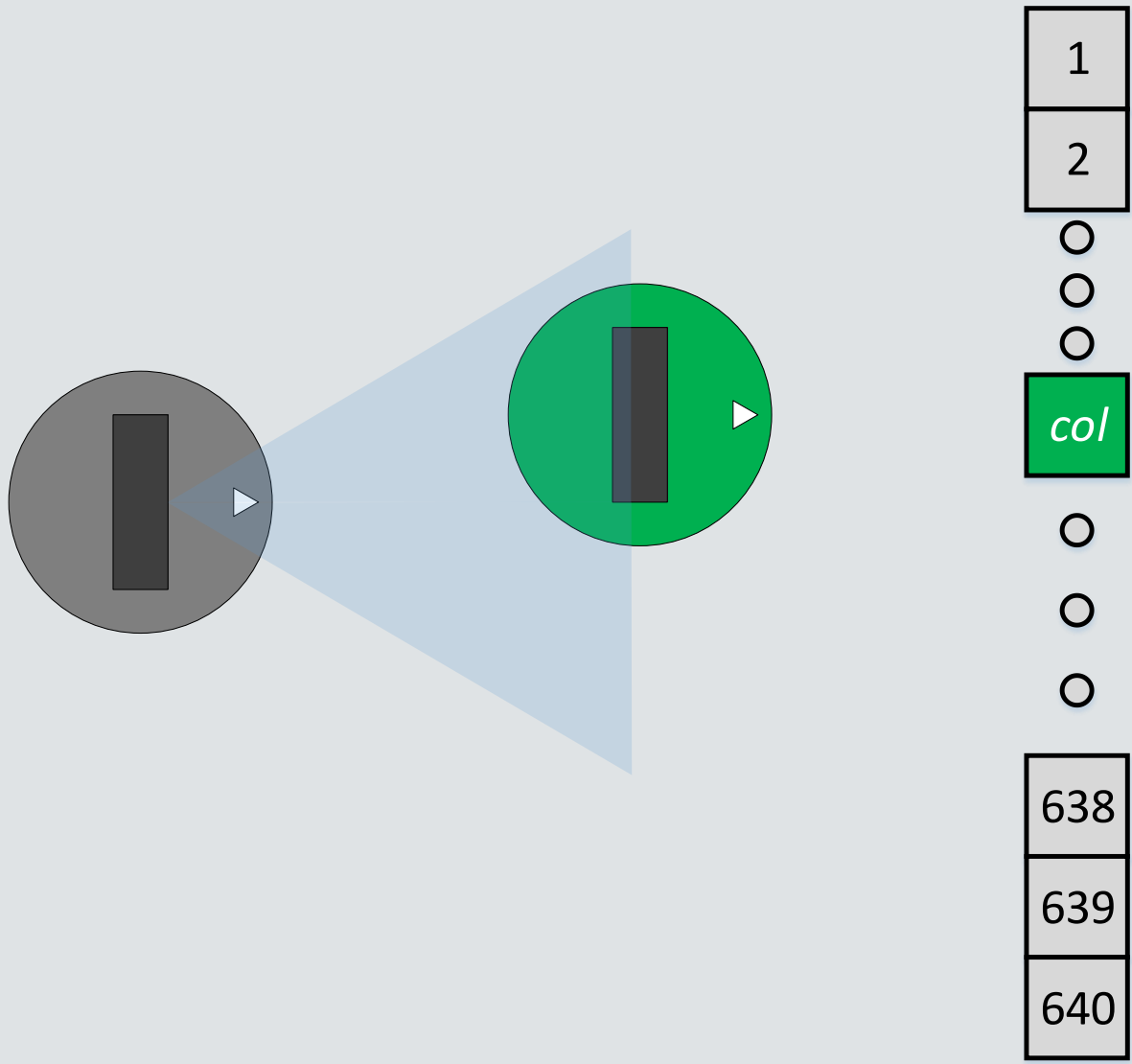


# Localization

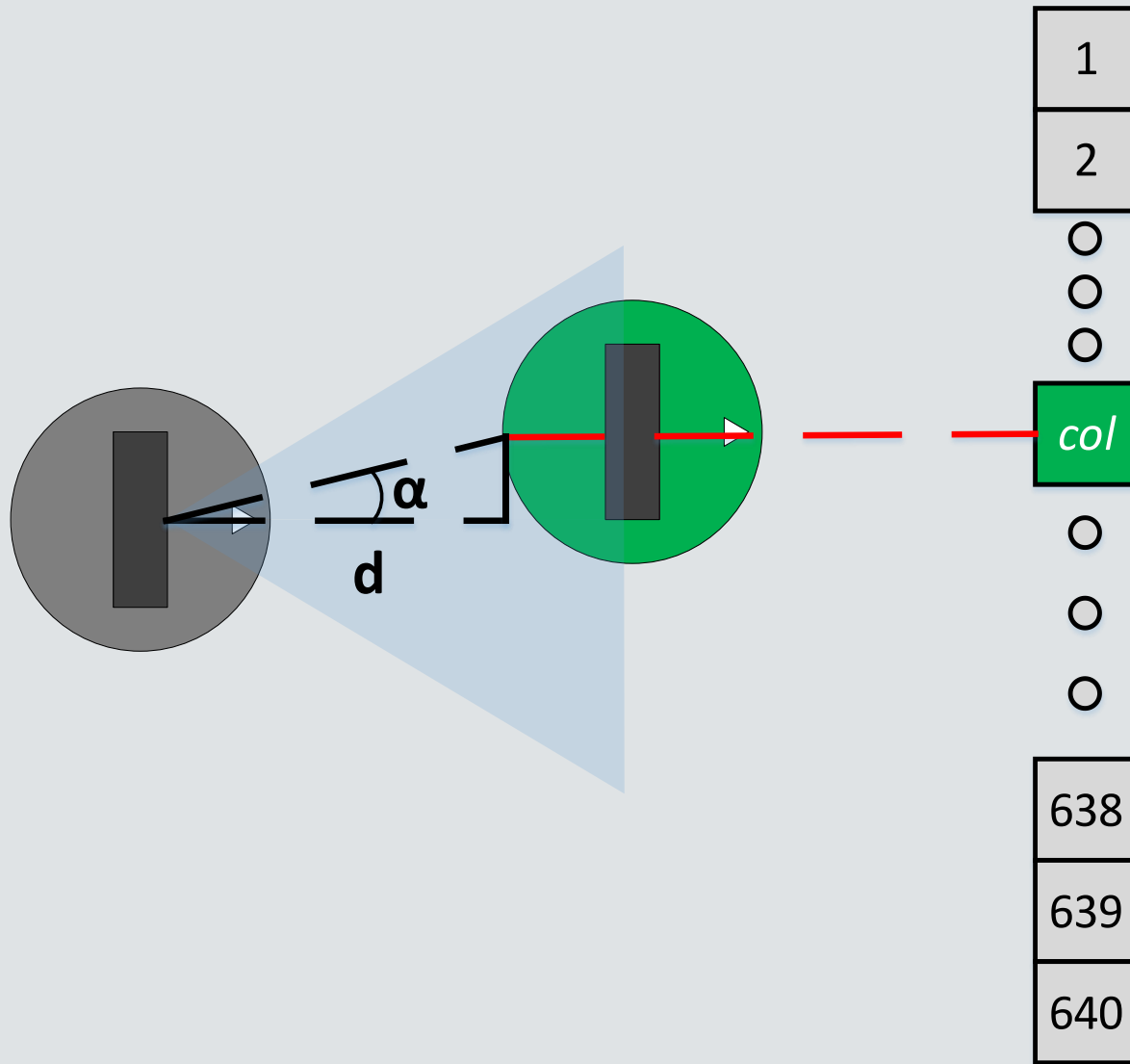
- Color Detection
- Depth Calculation
- Communication



# Localization – Color Detection



# Localization – Depth Calculation

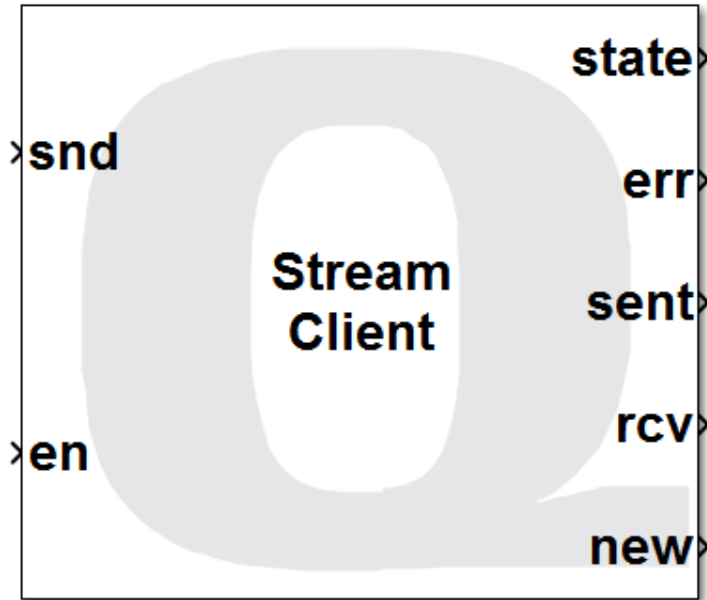


# Localization – Depth Calculation

- $\alpha = (320 - \textit{column}) * (57/640) * (\pi/180)$ 
  - $\alpha$  is obtained angle
  - *column* is the array column number
  
- $P_x = d$
- $P_y = d * \tan(\alpha)$ 
  - $d$  is depth

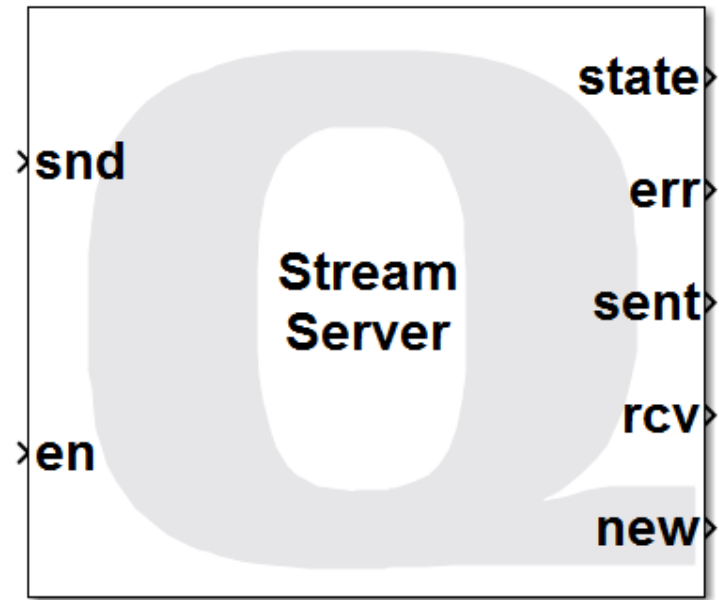


# Localization – Communication



**Stream Client**

"tcpip://remotehost:18000"



**Stream Server**

"tcpip://remotehost:18000"

# Point Consensus Control Algorithm

$$u_{ix}(t) = k_i \sum_{j=1}^n s_{ij}(t) (p_{jx}(t) - p_{ix}(t))$$

$$u_{iy}(t) = k_i \sum_{j=1}^n s_{ij}(t) (p_{jy}(t) - p_{iy}(t))$$

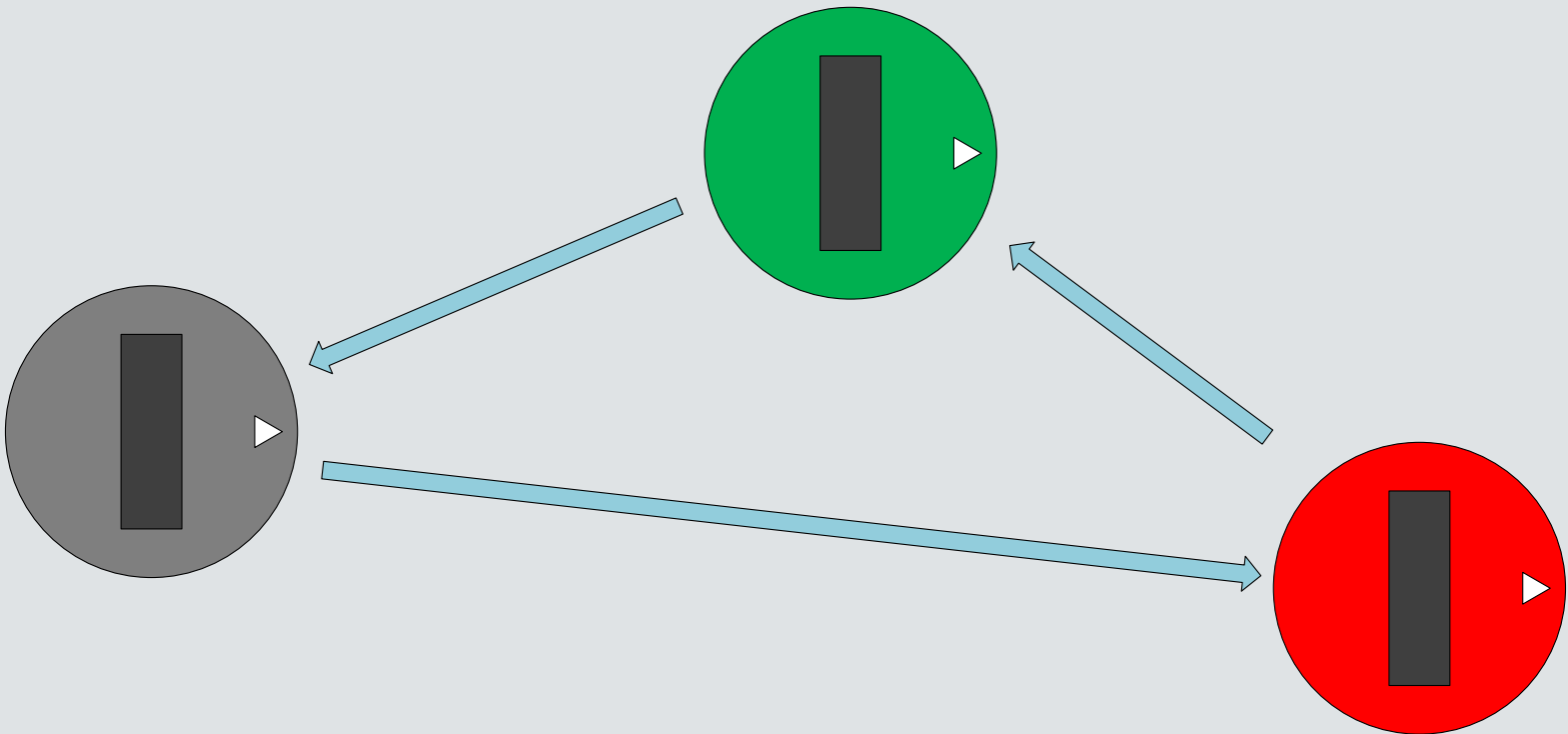
- Communication Topology

- $s_{ij}(t) = \begin{bmatrix} 1 & 1 & 0 \\ 0 & 1 & 1 \\ 1 & 0 & 1 \end{bmatrix}$

# Point Consensus

- Communication Topology

$$s_{ij}(t) = \begin{bmatrix} 1 & 1 & 0 \\ 0 & 1 & 1 \\ 1 & 0 & 1 \end{bmatrix}$$

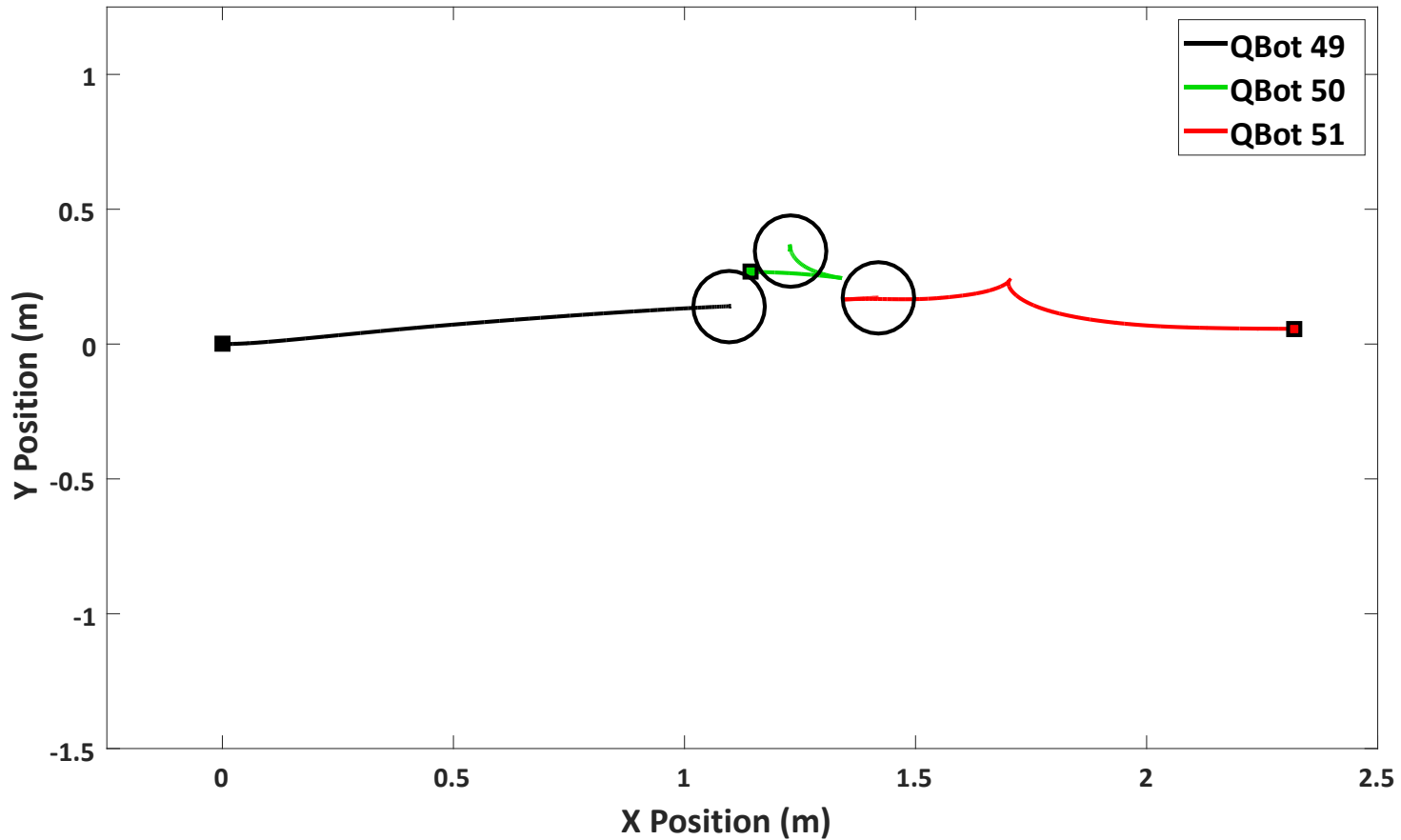


# Point Consensus



# Point Consensus

Point Consensus



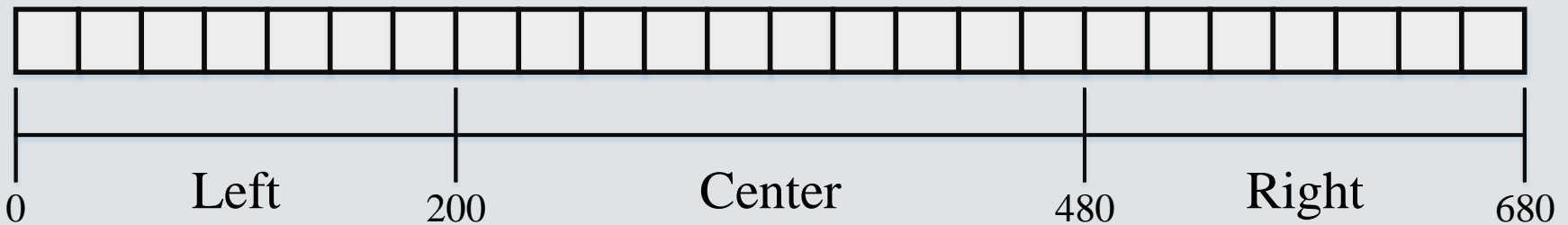
# Heading Alignment



# QBot 2 - Greg

# Object Avoidance

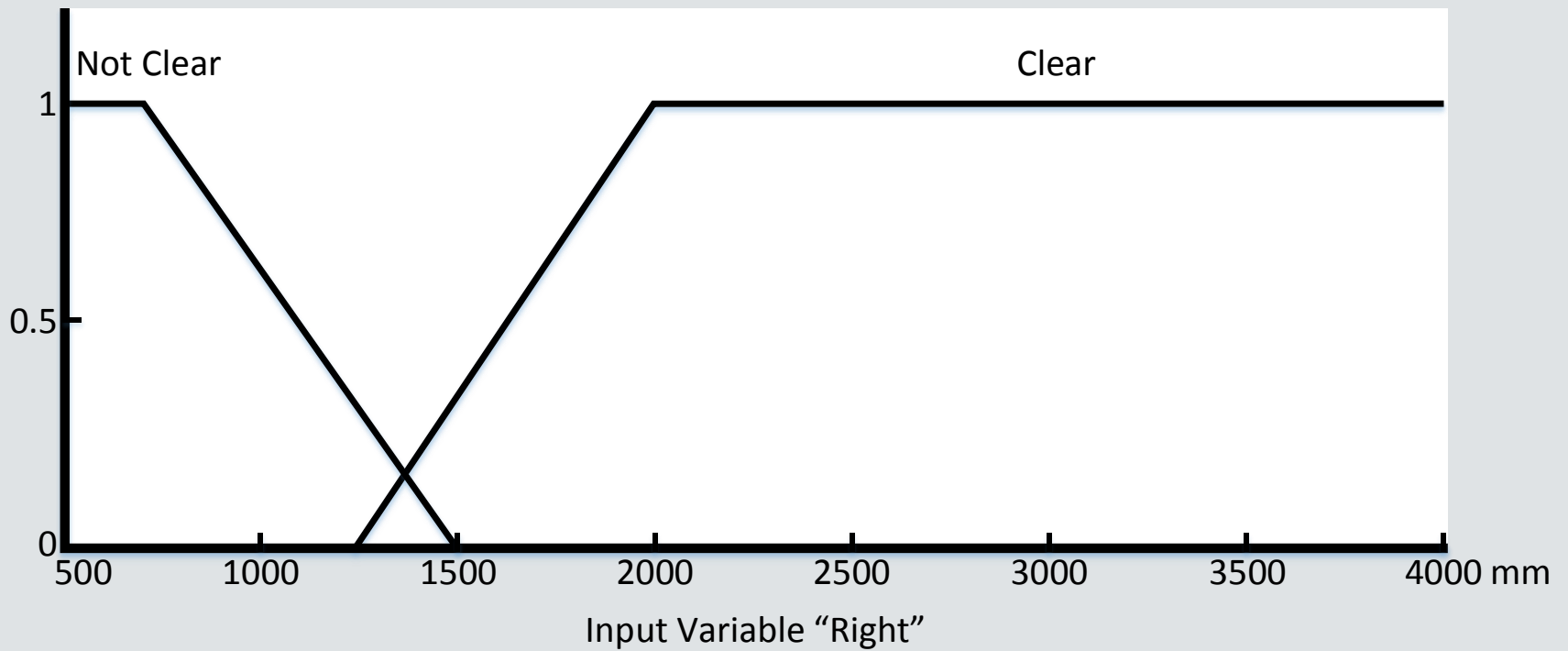
- Used Fuzzy Logic
  - Inputs taken from Xbox 360 Kinect
  - Outputs are left and right motor velocities





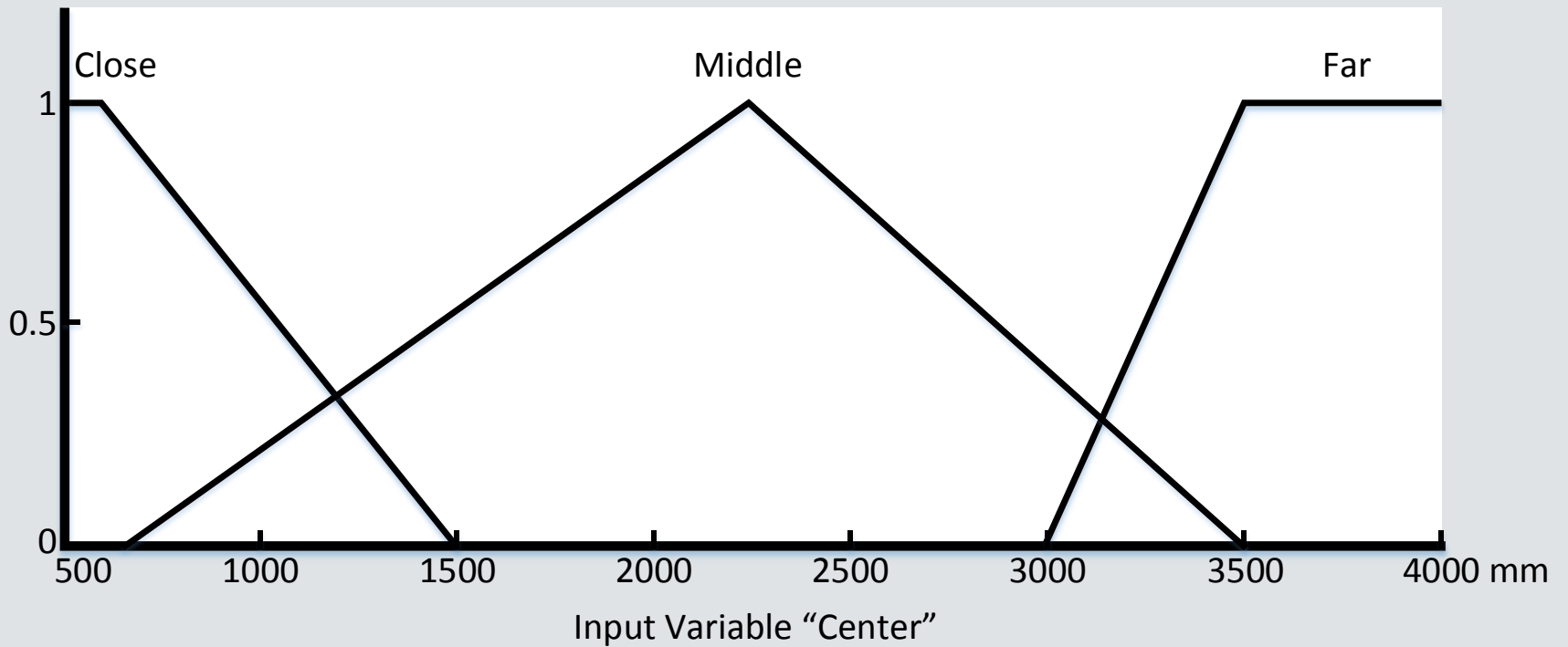
# Object Avoidance

Membership Function Plots



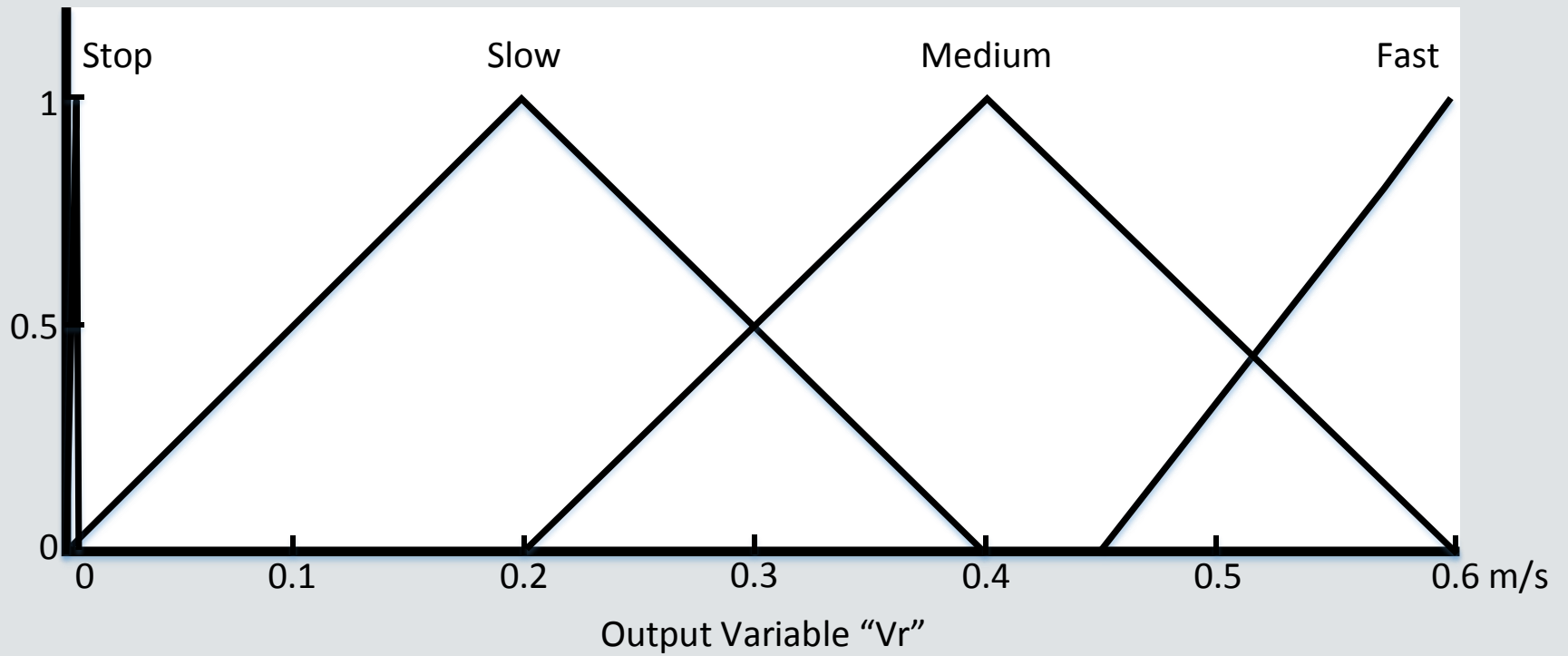
# Object Avoidance

Membership Function Plots



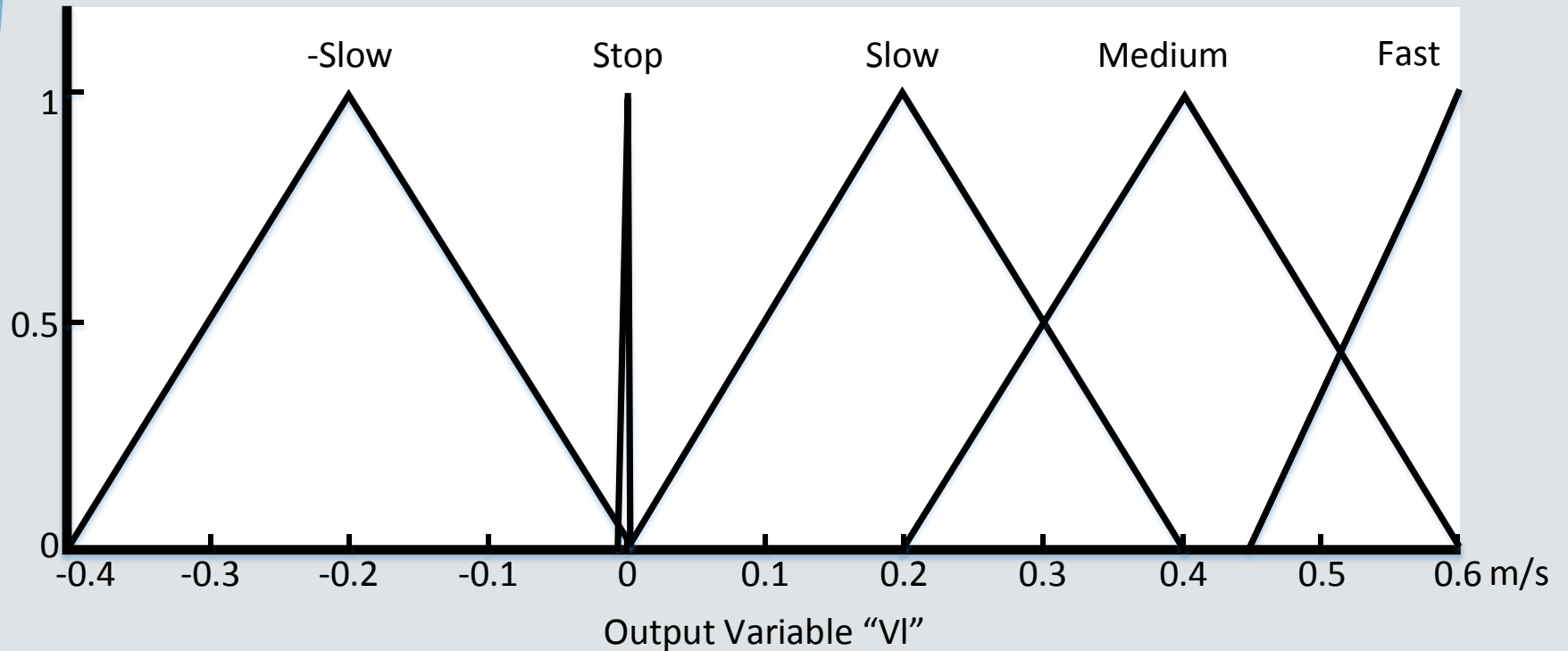
# Object Avoidance

Membership Function Plots



# Object Avoidance

Membership Function Plots



# Fuzzy Rule Set

Input			Output	
Left	Center	Right	$V_R$	$V_L$
-	Far	-	Medium	Medium
-	Middle	-	Slow	Slow
Not Clear	Close	Not Clear	Slow	-Slow
Clear	Close	Not Clear	Slow	Stop
Not Clear	Close	Clear	Stop	Slow
Clear	Close	Clear	Slow	Stop

# Object Avoidance

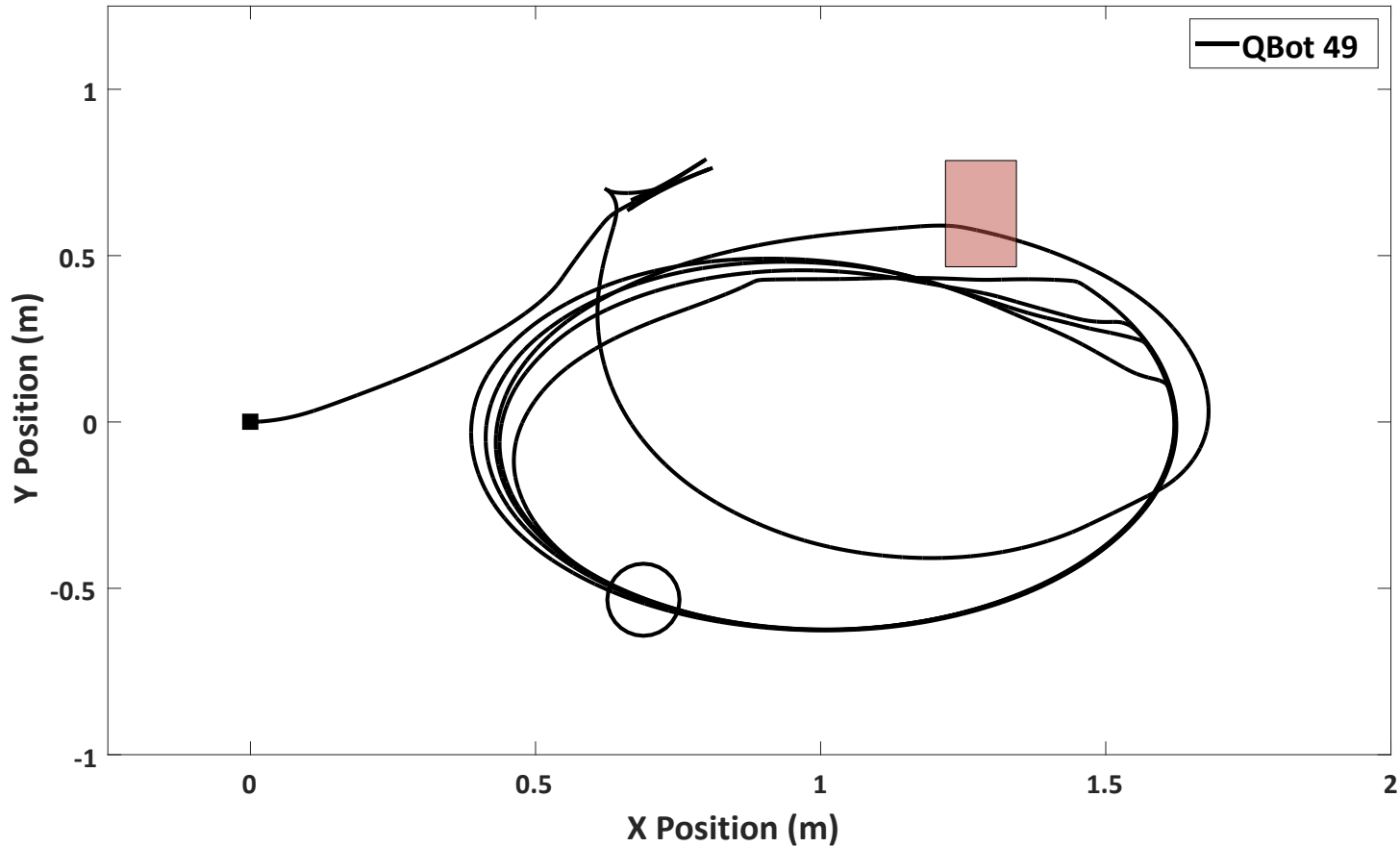
- $V_L = k(x_d - x) + \dot{x}_d + \Delta V_L$
- $V_R = k(y_d - y) + \dot{y}_d + \Delta V_R$

# Object Avoidance



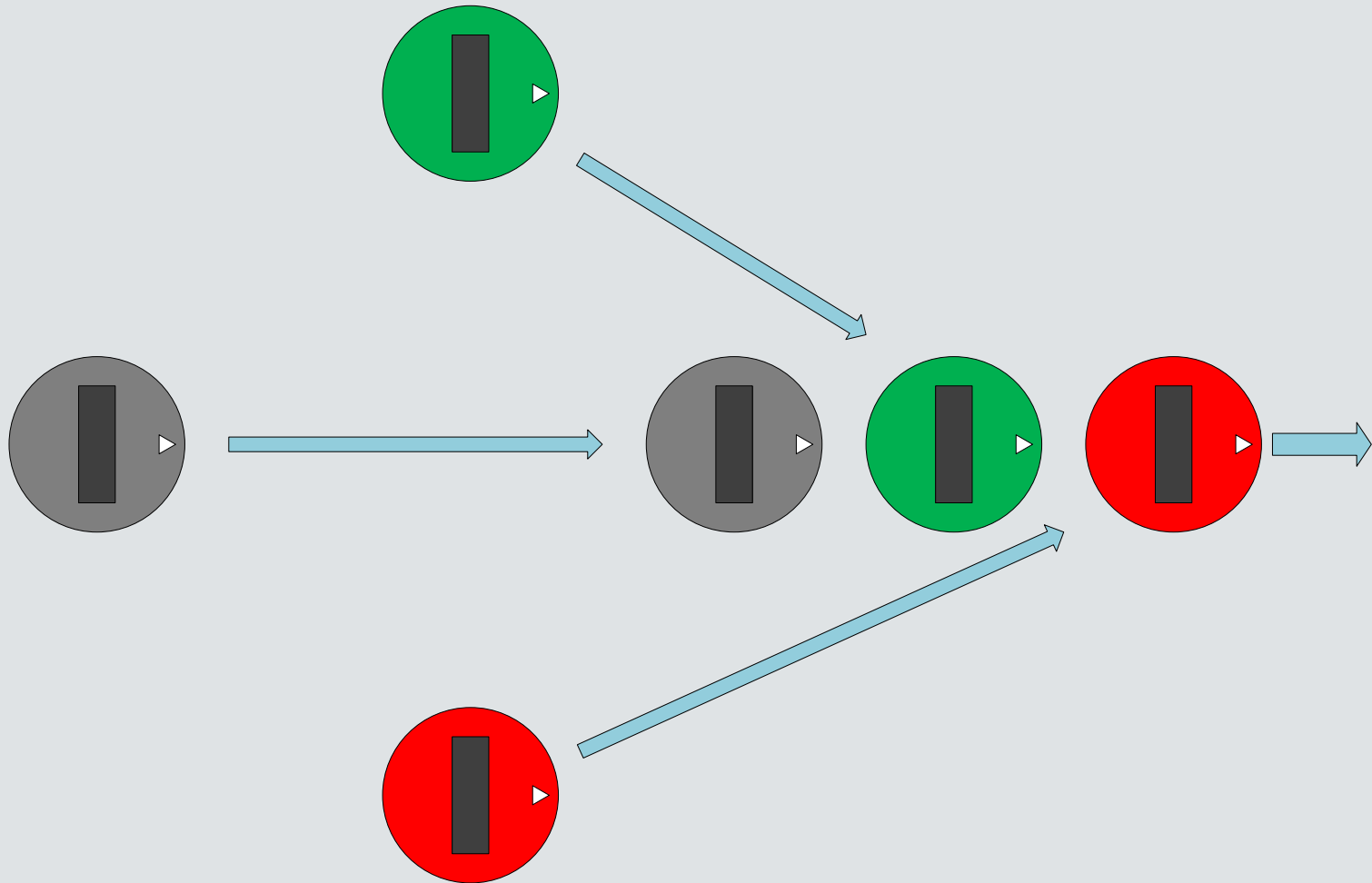
# Object Avoidance

Object Avoidance





# Formation Control



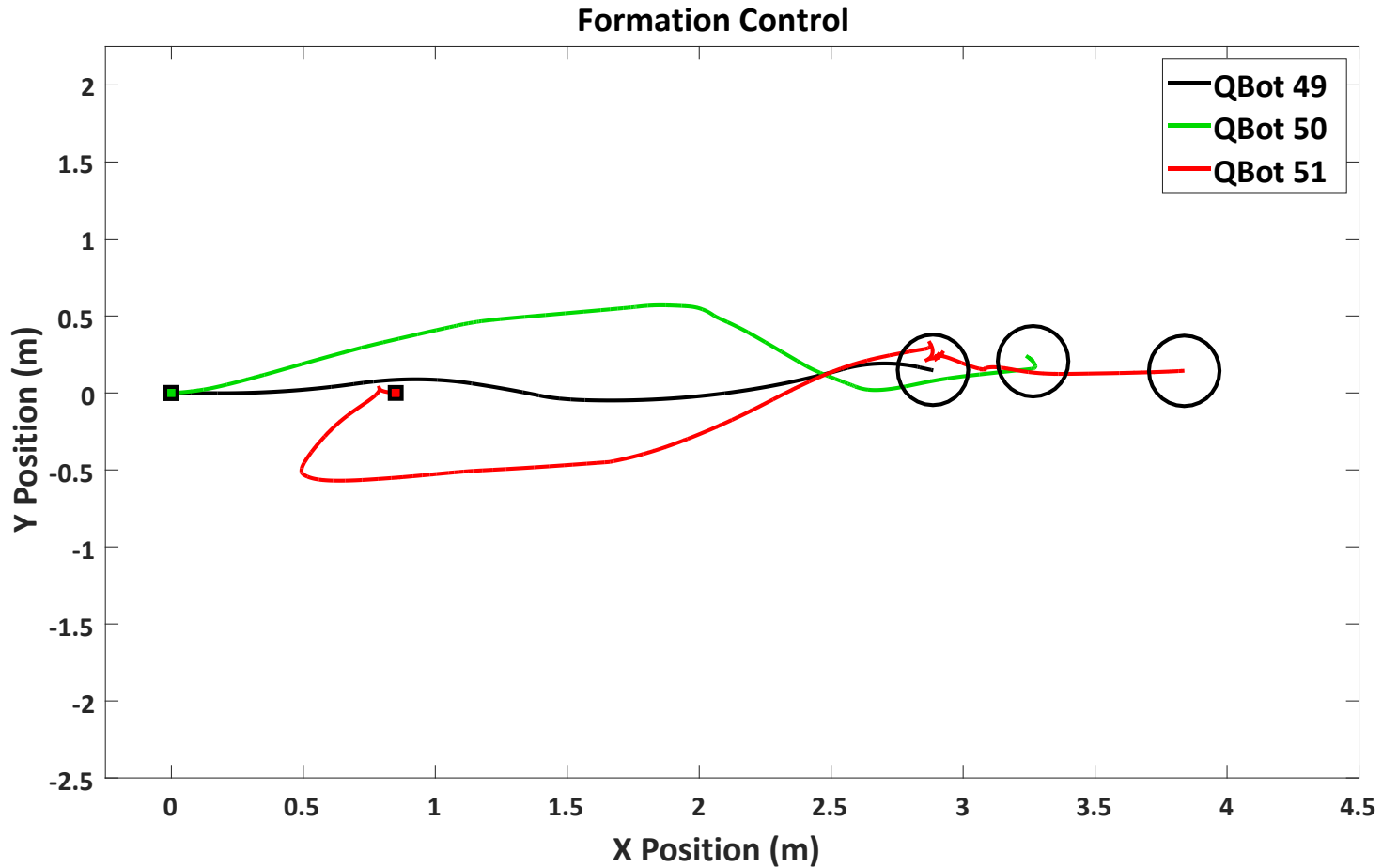
$$u_{ix}(t) = k_i \sum_{j=1}^n s_{ij}(t) (p_{jx}(t) - C_{jx} - p_{ix}(t) + C_{ix})$$

$$u_{iy}(t) = k_i \sum_{j=1}^n s_{ij}(t) (p_{jy}(t) - C_{jy} - p_{iy}(t) + C_{iy})$$

# Formation Control



# Formation Control



# IV. Summary & Conclusions

# Problems Encountered

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- E-puck
  - CMOS camera
  - For communication between different platforms, additional circuitry was needed
- Kilobot
  - Kilobot motors need frequent calibration
  - Small size makes it difficult for QBot 2 to detect
  - Lack of sensory information

# Summary & Conclusions

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- Designed cooperative control algorithms for heterogeneous groups of robots
- Implemented algorithms on different robot platforms

# Future Work

- Cross-platform communication
- Implement E-puck camera
- Further development of formation algorithms
- Complete E-puck to Kilobot communication
- Add IR messaging system to QBot 2
- Improve QBot 2 algorithm to avoid objects consistently



# Acknowledgements

- Our group would like to thank Dr. Wang & Dr. Ahn for their support throughout the project.
- Our group would also like to thank Mr. Mattus and Mr. Schmidt for their technical support.



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Department of Electrical and Computer Engineering

April 26<sup>th</sup>, 2016

# Division of Labor Overview

<b>Individual Behavior</b>	Kilobots	Jared
	QBot 2s	Ryan/Greg
	E-pucks	Brittany/Jared
<b>Individual Communication</b>	Kilobot - Kilobot	Jared
	QBot - QBot	Ryan/Greg
	E-puck - E-puck	Brittany/Jared
<b>Integrated Communication</b>	Kilobot - E-puck	Jared/Brittany
	Kilobot - QBot	Jared/Ryan/Greg
	E-puck - QBot	Brittany/Ryan/Greg
<b>Algorithm Design</b>	Linearization Based Model	Jared/Brittany/Ryan/Greg
<b>Integrated Behavior</b>	Formation Control Behavior	Jared/Brittany/Ryan/Greg
	Flocking Behavior	Jared/Brittany/Ryan/Greg
<b>Testing</b>	Software Implementation	Jared/Brittany/Ryan/Greg
	Hardware Implementation	Jared/Brittany/Ryan/Greg

# Algorithm Test Platforms

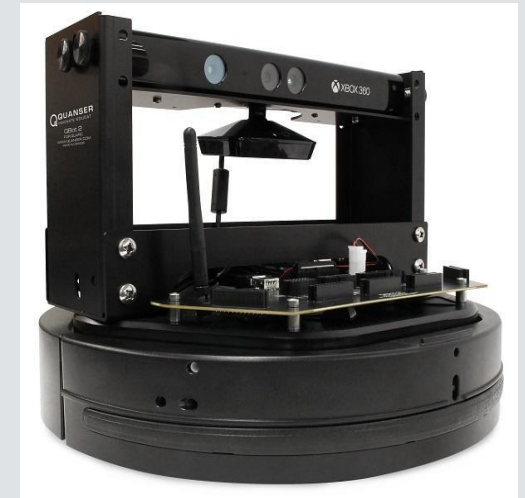
Kilobot



E-Puck



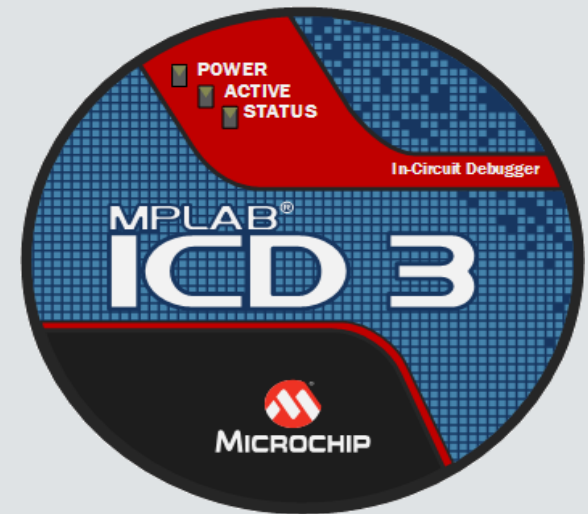
QBot 2



# Unbricking the E-pucks

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- Uses the MPLAB ICD 3 In-circuit Debugger
- MPLAB IDE v8.30
- Erases the Flash memory by powering the E-puck through the ICD 3



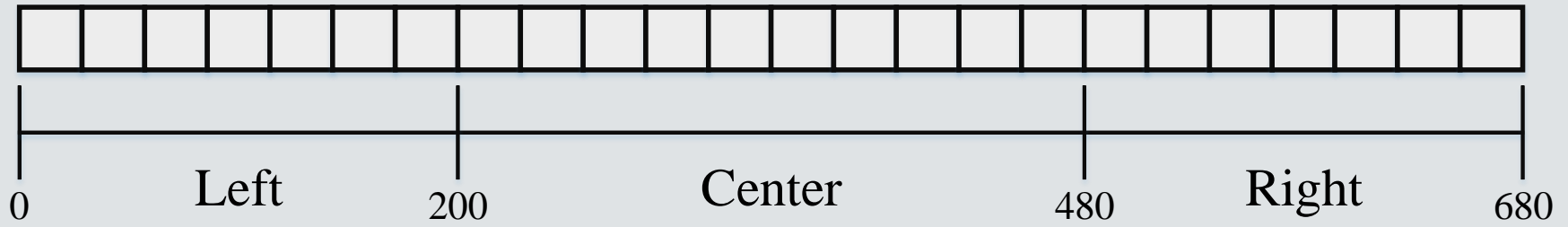
# Changing the Original Timer

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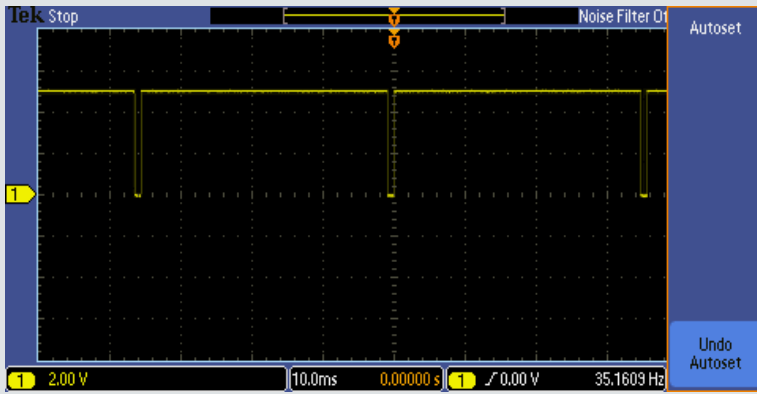
- E-puck's clock speed is 8 times faster than the Kilobot
- Increased the timer of the E-puck by a factor of 8 to slow down the rate at which the message was sent to Kilobot
- Change was made to allow Kilobots to sync with E-puck messaging

# Object Avoidance

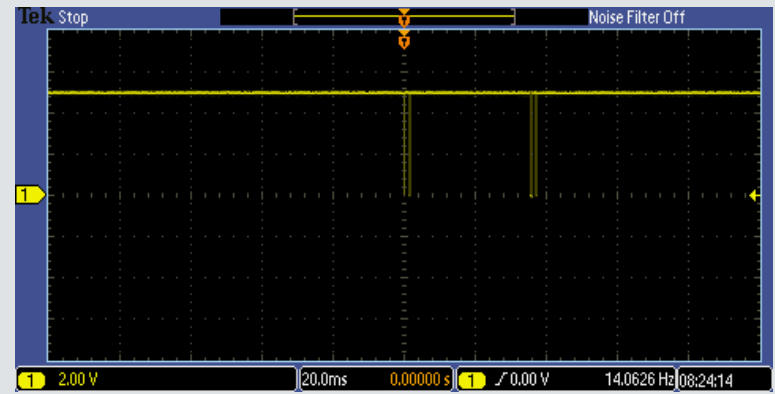
- Inputs taken from Xbox 360 Kinect



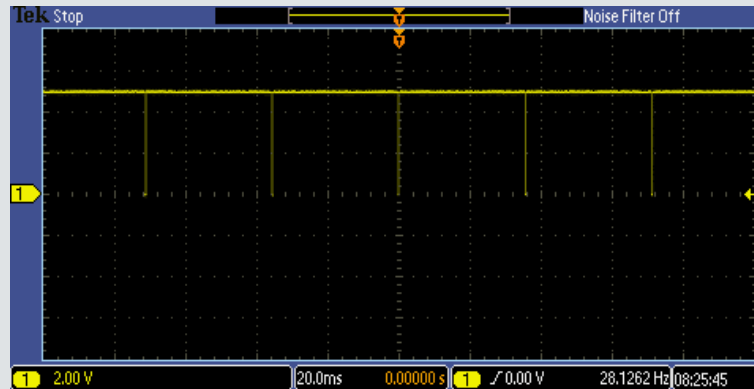
# Oscilloscope Screen Captures from the Infrared Receiver Circuit



Original timer used in initial Kilobot testing



Increased original timer by a factor of 8



Decreased original timer by a factor of 8



# Advanced Localization: Distributed Trilateration

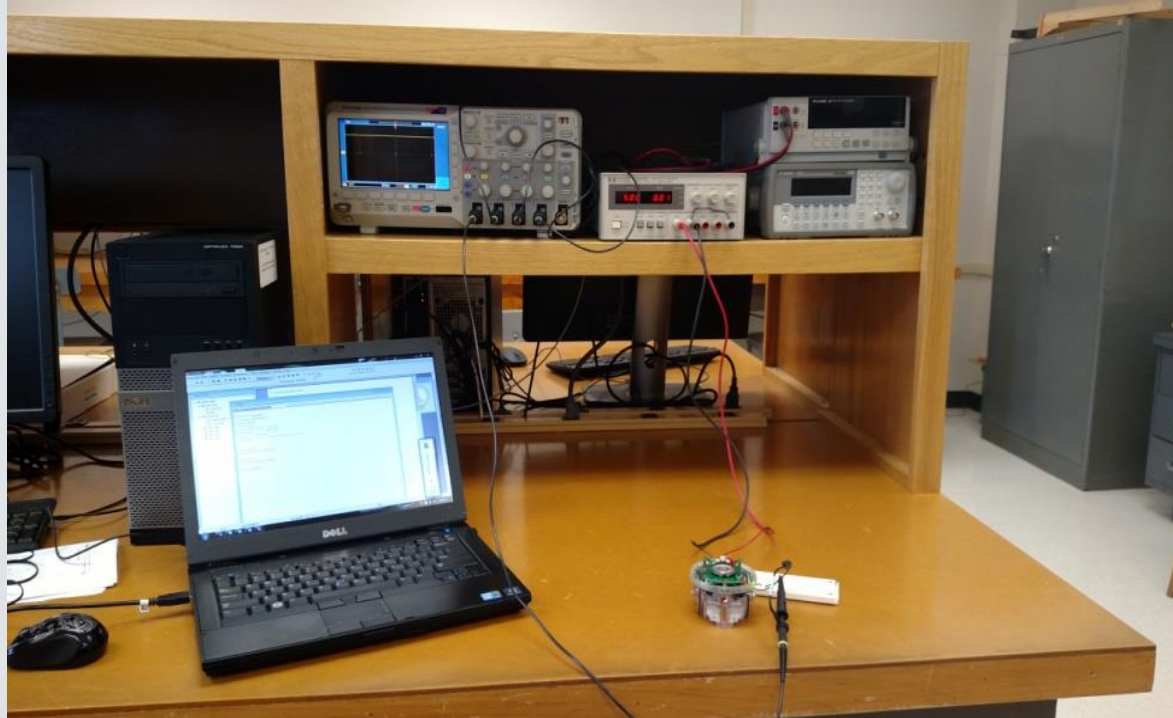
- Gradient is only a 1D localization
- Minimum of 3 fixed agents as reference points
- Non-localized agents assume position (0,0)
- Determine actual distance to non-localized agent
- Calculate assumed distance

# Advanced Localization: Distributed Trilateration

- Direction Vectors are generated from reference to unknown
- Generate assumed coordinates from Vectors and measured Distances
- New position is determined using assumed position and previous position

# Integrated Communication Set-up

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# Project Platform Costs

<b>Platform</b>	<b>Quantity</b>	<b>Total Price</b>
QBot 2	3	\$9,999.00
Kilobot Kit	20	\$4,583.00
Epucks	3	\$5,093.00

# Programming Software Costs

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<b>Software</b>	<b>Quantity</b>	<b>Total Price</b>
Kilobot Controller IDE	1	\$0.00
E-puck Programming Software	1	\$0.00
MATLAB Courseware	1	\$0.00

# E-puck Object Following Code

```
/*
*****
** Motor speed controlled depending on front proximity sensor values **
*****
*/

#include "p30f6014A.h"
#include "e_epuck_ports.h"
#include "e_init_port.h"
#include "e_ad_conv.h"
#include "e_prox.h"
#include "e_motors.h"

#define DELAY 50000

int main() {

    long timer = 0;

    //system initialization
    e_init_port(); // configure port pins
    e_init_ad_scan(ALL_ADC); // configure Analog-to-Digital Converter Module

    while (1) {

        if (e_get_prox(0) > 500) { //escape
            e_set_speed_left(0);
            e_set_speed_right(0);
        } else if (e_get_prox(0) > 100) { //follow
            e_set_speed_left(400);
            e_set_speed_right(400);
        } else { //stop
            e_set_speed_left(0);
            e_set_speed_right(0);
        }

        //wait a little to let the robot move
        for(timer = 0; timer < DELAY; timer++);

    }
}
```

# QBot Point Convergence Code

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```
v11 = k1*(z21 - z11); % Calculate velocity in x direction
v12 = k2*(z22 - z12); % Calculate velocity in y direction
mat = [cos(myTheta) -d/2*sin(myTheta); sin(myTheta) d/2*cos(myTheta)];
myControl = inv(mat)*[v11;v12];

% Determine total velocity
V = myControl(1);

% Determine angular velocity
omega = myControl(2);

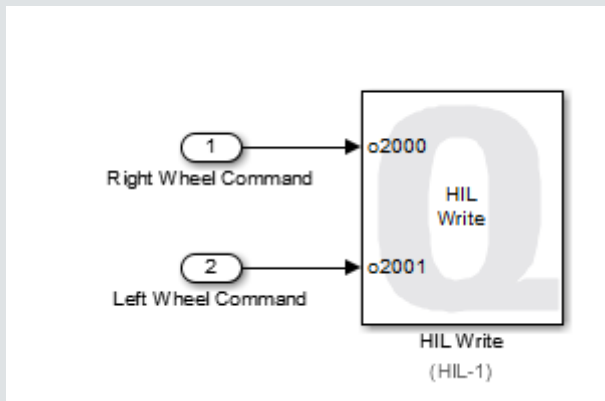
% Determine left and right wheel velocity
Vl = (2*V-d*omega)/2;
Vr = (2*V+d*omega)/2;
```

# QBot Obtained Angle Equation

- $\alpha = (320 - \textit{column}) * (57/640) * (\pi/180)$



# HIL Write Block



Source Block Parameters: HIL Write

**HIL Write**  
Writes to a combination of output channels of a hardware-in-the-loop card.

**Navigation**  
Go to HIL blocks using this board...

Board name: HIL-1

Analog channels:  
[ ] ...

PWM channels:  
[ ] ...

Digital channels:  
[ ] ...

Other channels:  
[2000:2001] ...

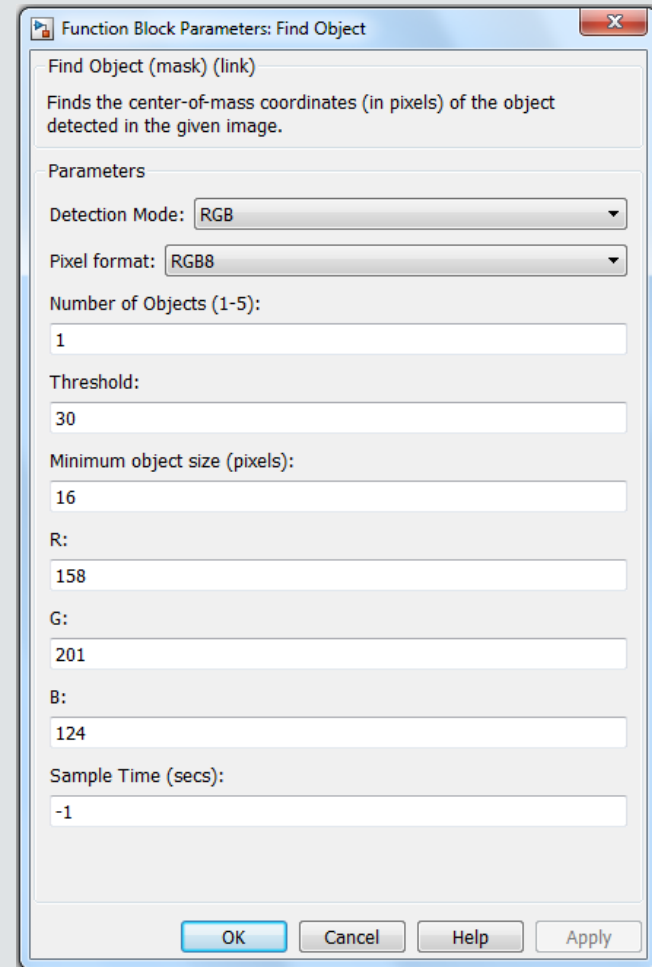
Sample time (seconds):  
-1

Vector inputs

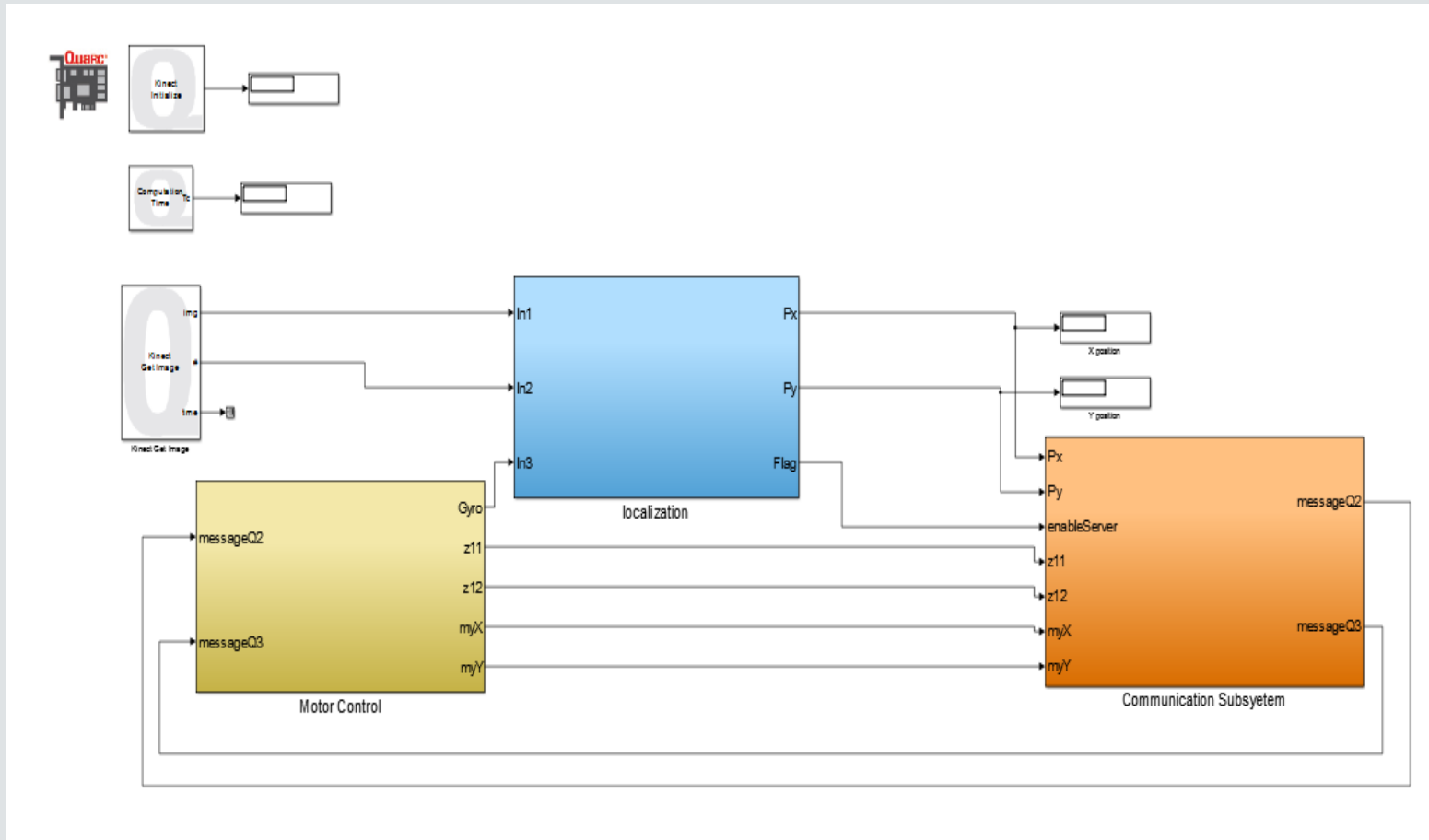
OK Cancel Help Apply

# Find Object Parameters

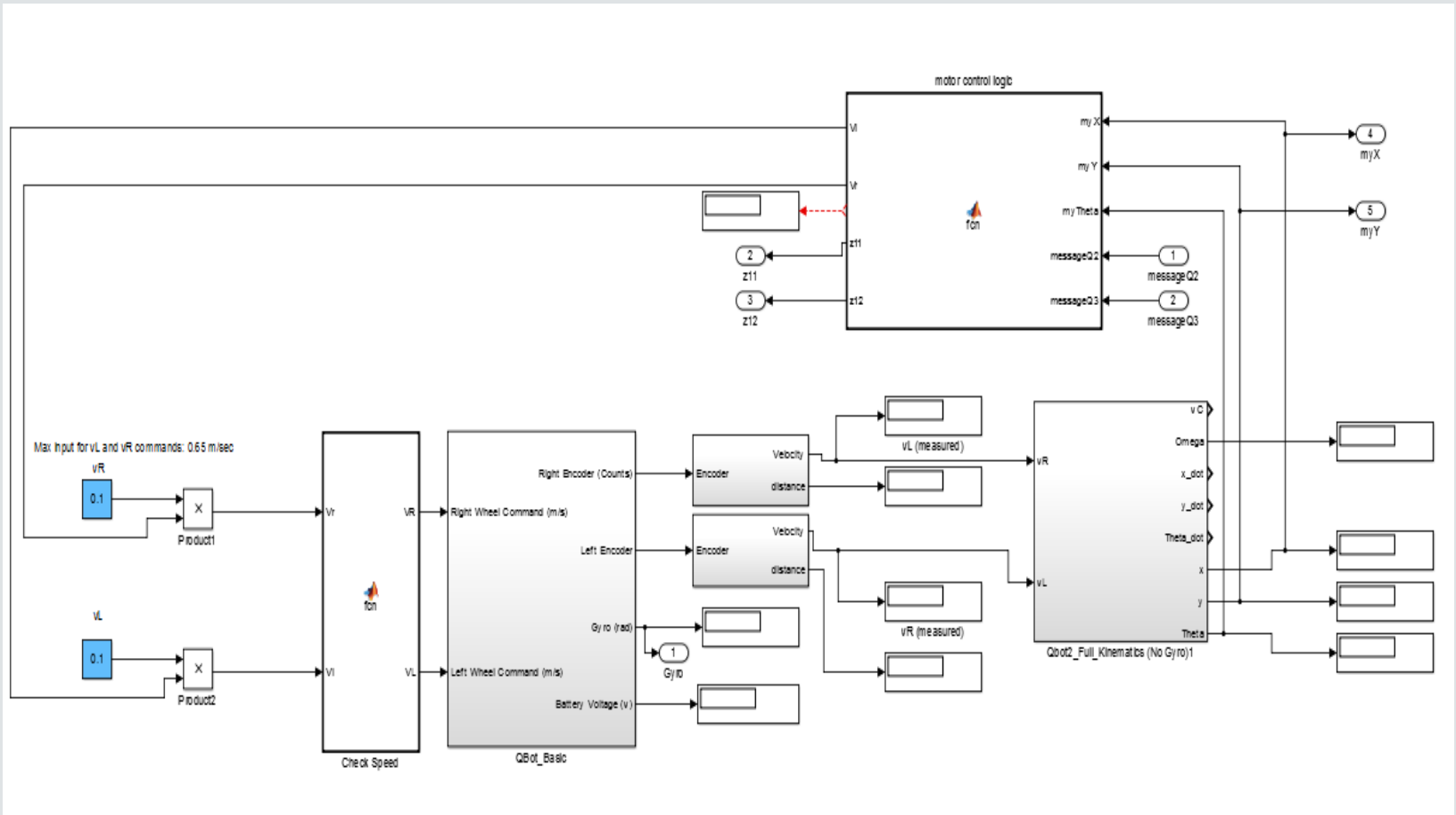
- Specify RGB values
- Value threshold
- Number of objects



# Overall Simulink Model



# Motor Control



# Localization Equations

- $C_i = \sqrt{(x_0 - x_i)^2 + (y_0 - y_i)^2}$
- $V_i = \left\langle \frac{x_0 - x_i}{C_i}, \frac{y_0 - y_i}{C_i} \right\rangle$
- $n_i = (x_i, y_i) - D_i * V_i$
- $(x_0, y_0) = (x_0, y_0) - \frac{(x_0 - n_{ix}, y_0 - n_{iy})}{4}$

# Color Consensus

- Kilobots are initialized with a random number
- Each number corresponds to a color
- Kilobots then begin transmitting value
- Kilobots receive messages and keep track of how many neighbors are what color
- Kilobots then change their color to most prevalent color

# Color and Object Detection

- The E-puck CMOS camera is capable of 640X480 resolution, in color or grayscale
- However, the image is too large to process, so instead we use a 1X120 image
- Color uses RGB565, where each pixel has 5 bits for red, 6 bits for green, and 5 bits for blue

# Color and Object Detection

- First step to object detection is edge detection
- The image array is searched for two edges, from both left and right starting positions
- Individual pixels are compared to the average of the previous ten pixels
- If the difference is greater than three, that location is set as an edge
- Based on the number of edges found (0,1,2,3,4), The E-puck calculates where the center of the object is, and how wide it is.



# Color and Object Detection

- After Edge detection is complete, the E-puck moves on to color comparison
- The E-puck computes the average RGB value of the object
- The average is compared to the specified value within a certain tolerance
- If the comparison is acceptable, The E-puck begins maneuvering to it.

# Odometry

- $\Delta \theta = \frac{(\Delta R - \Delta L)}{2}$
- $\Delta S = \frac{(\Delta R + \Delta L)}{2}$
- $\Delta x = \Delta S * \cos\left(\theta + \frac{(\Delta\theta)}{2}\right)$
- $\Delta y = \Delta S * \sin\left(\theta + \frac{(\Delta\theta)}{2}\right)$
- $x(k + 1) = x(k) + \Delta x$
- $y(k + 1) = y(k) + \Delta y$
- $\theta(k + 1) = \theta + \frac{(\Delta\theta)}{3}$