

# Simultaneous Localization and Mapping using ZigBee Protocol

## Project Proposal

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# Outline

- 1 Introduction
- 2 Background Study
- 3 Functional Requirements
  - Specifications
- 4 Preliminary Results
  - Simulation
  - Design
  - Experimental Activities
- 5 Parts List
- 6 Deliverables
- 7 Timeline and Milestones
- 8 Future Directions

# Introduction

## Applications

- Warehouses
- Cleaning systems
- Robotic concierge
- Large office mail systems
- Mining
- Research and education

## Problem Statement

Design and implementation of a low-cost localization and mapping system using off-the-shelf hardware components.

# Background Study

## Literature

- Most systems in research environments utilize RFID
- Directional antennas with wireless sensor beacons
- Using a parabolic reflector to estimate angle-of-arrival
- Research literature showing proof of concept and not a real world implementation
- Implemented on custom, purpose-built mobile robots

# Background Study

## Challenges

- Accuracy of measurements, mapping, and localization
- Improve signal-to-noise ratio (SNR)
- Balancing cost and accuracy in the number of wireless beacons

# Terminology

- Pose:  $\mathbf{q} = [x, y, \theta]^T$
- Root Mean Square Error:  $\text{RMSE} = \sqrt{\frac{1}{t_f} \int_0^{t_f} [e(t)]^2 dt}$
- Robot error:  $e_P(t) = \sqrt{(\hat{x}(t) - x^d(t))^2 + (\hat{y}(t) - y^d(t))^2}$
- $e_B(t) = \sum_{i=1}^n e_i(t)$  where  
$$e_i(t) = \sqrt{(\hat{x}_i(t) - x_i^d(t))^2 + (\hat{y}_i(t) - y_i^d(t))^2}$$

# Functional Requirements

## System Architecture

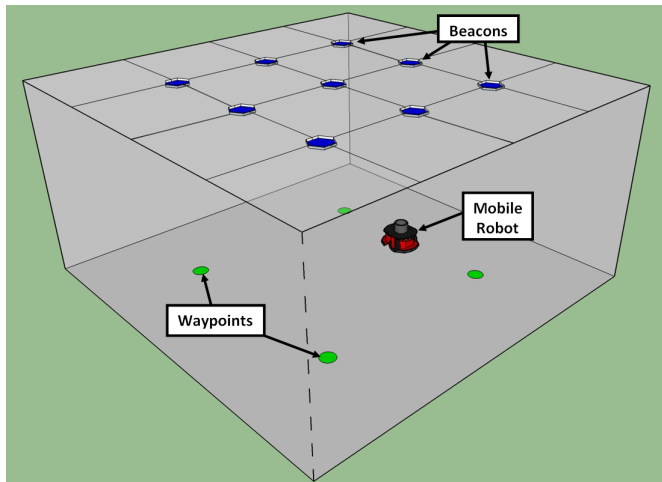


Figure: System Architecture

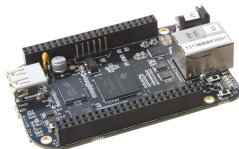


# Functional Requirements

## System Architecture



(a)



(b)



(c)

- Mobile robot (Pioneer 3-DX)
- Interfaced using BeagleBone Black running Robot Operating System (ROS indigo<sup>1</sup>)
- Ceiling mounted beacons (XBee modules)
- Predefined waypoints (implemented in algorithm)

<sup>1</sup>[www.ros.org](http://www.ros.org)

# Functional Requirements

## System Block Diagram

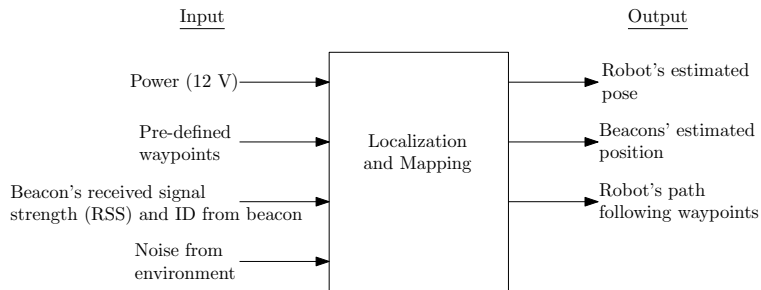


Figure: System block diagram

# Functional Requirements

## Subsystem Block Diagram

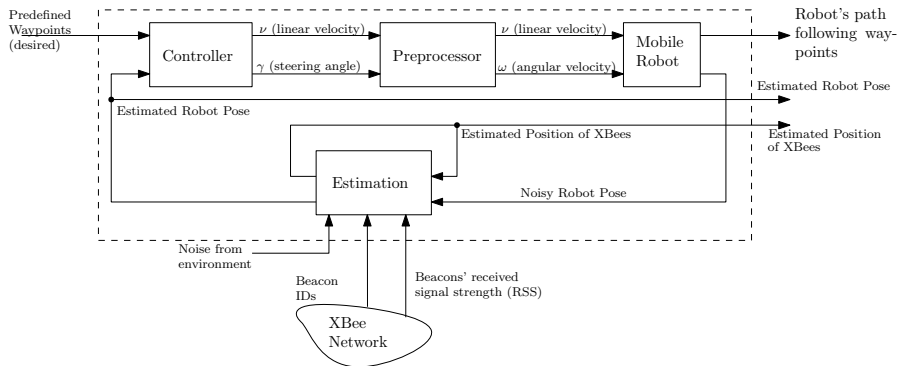


Figure: Subsystem block diagram

# Functional Requirements

## Subsystem Block Diagram

- Four subsystems
  - Controller
  - Preprocessor
  - Mobile Robot
  - Estimation
- Outputs are for debugging, used internally for implementing EKF-SLAM algorithm

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# Functional Requirements

## Specifications

- Cost under \$500
- Localize mobile robot with  $RMSE \leq 30$  cm
- Estimate beacon positions with  $RMSE \leq 30$  cm
- Use ROS

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- Real-time robot simulator
- Advantages
  - Simulates all dynamics of the robot (driving kinematics, object physics, sensors)
  - Easy to use through a variety of programming languages
  - Provides real-time simulation data for use in algorithm



# Preliminary Results

## Simulation Setup

- Time step,  $T = 0.25$  s
- Linear velocity standard deviation,  $\sigma_v = 8.8858 \times 10^{-4}$
- Angular velocity standard deviation,  $\sigma_\omega = 0.0012$
- Observation range standard deviation,  $\sigma_R = 1$
- Observation bearing standard deviation,  $\sigma_B = 5^\circ$
- Maximum Pioneer linear velocity is  $1.2 \text{ m s}^{-1}$
- Maximum Pioneer angular velocity is  $300^\circ \text{ s}^{-1}$
- Other parameters: 9 beacons, 2000 iterations, observations every 8 iterations

# Preliminary Results

## Simulation

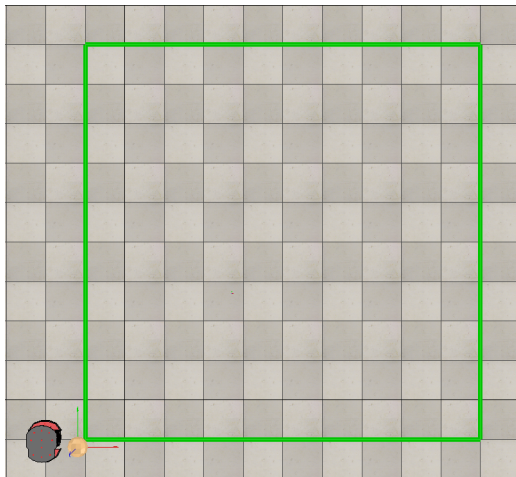


Figure: Starting configuration of the V-REP simulation

# Preliminary Results

## Simulation

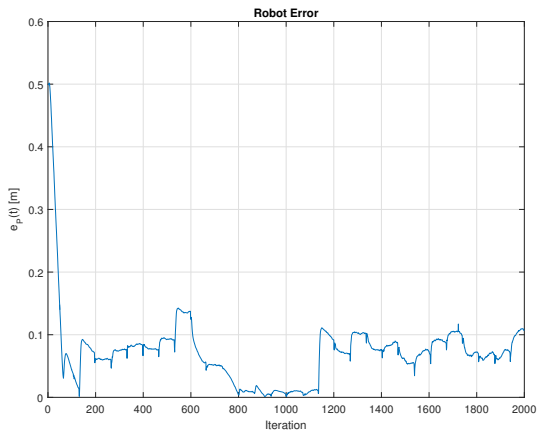


Figure: Robot error from simulation over 2000 iterations with an RMSE of 0.0928

# Preliminary Results

## Simulation

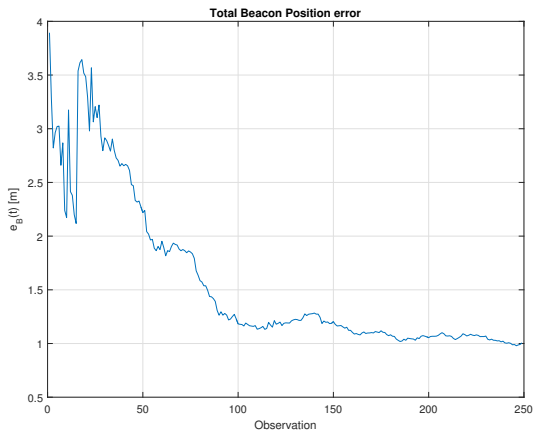


Figure: Total beacon error from simulation over 250 observations with an RMSE of 1.7254

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# Preliminary Results

## Design

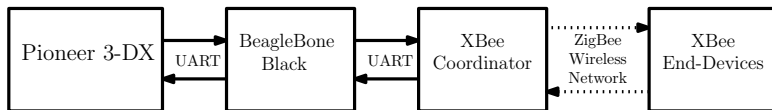


Figure: System interfaces

# Preliminary Results

## Design

- Basic wireless communication between two XBees in X-CTU, XBee configuration software, running on a PC.
- C program running on BeagleBone Black which interfaces with XBee via UART for basic communication between two XBees.
- Expanded C program with the help of open source library *libxbee*<sup>2</sup> to packet-based communication.
- Current functionality to obtain RSSI from beacons:
  - Robot mounted XBee (Coordinator) transmits ping signal to beacons. Beacons will register the RSSI.
  - Coordinator then requests beacons (End-Devices) to return individual IDs and registered RSSI.

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<sup>2</sup><https://github.com/attie/libxbee3>

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# Preliminary Results

## Experimental Activities

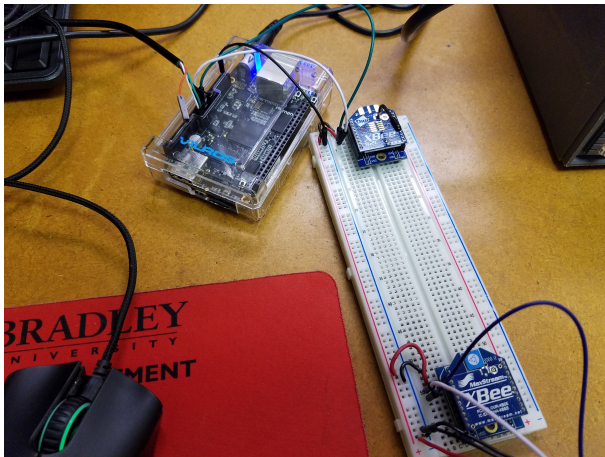


Figure: Lab set up for experiments

# Preliminary Results

## Experimental Activities

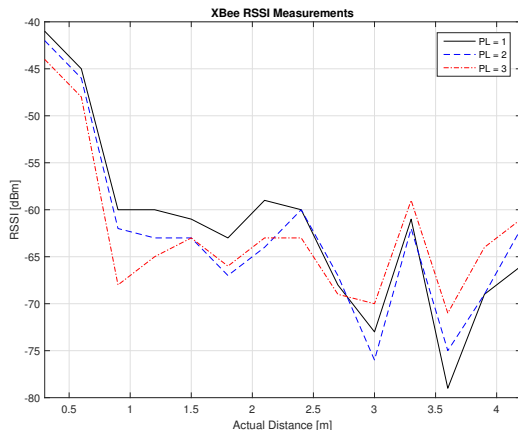


Figure: RSSI vs. Actual Distance

# Preliminary Results

## Experimental Activities

$$d = f(\text{RSSI})$$

$$d = 10^{\frac{-\text{RSSI} - P_{\text{ref}}}{10\eta}}$$

where  $d$  is the calculated distance, RSSI is the measured RSSI,  $P_{\text{ref}}$  is the power level at a reference distance of 1 m, and  $\eta$  is the propagation constant

# Preliminary Results

## Experimental Activities

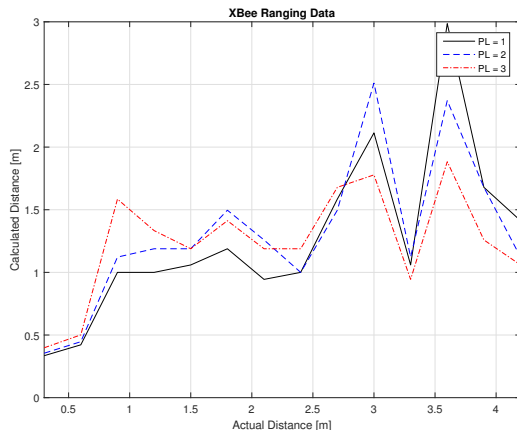


Figure: Calculated Distance vs. Actual Distance

# Parts List

This list does not include parts already in the lab such as the Pioneer 3-DX, wire, capacitors, or resistors. We were also fortunate enough to have access to a BeagleBone Black and some XBee modules for experimentation without having to place a parts request.

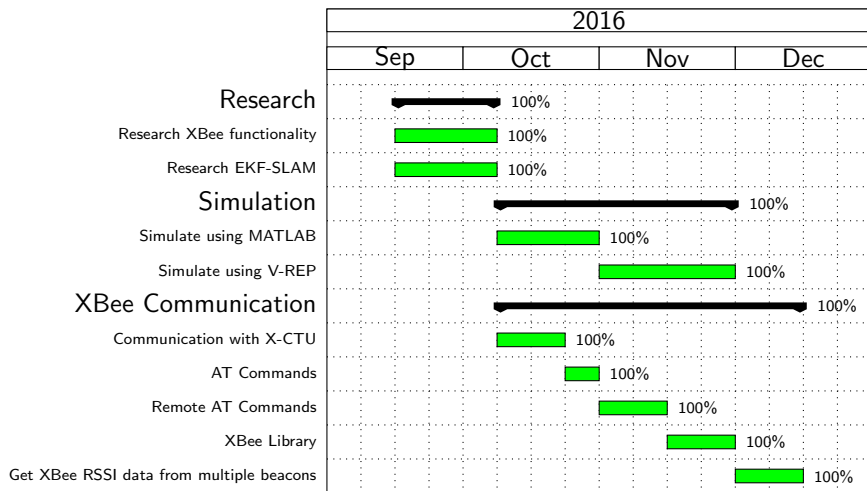
Part	Price	Quantity
XBee S2C w/ whip antenna	\$18.19	6
XBee Interface Board	\$5.31	6
Perforated Circuit Board	\$2.84	4
Stepper Motor	\$14.95	1
Motor Controller	\$19.95	1
3.3V Regulator	\$0.79	10
9V Battery Clip	\$0.39	10

Table: List of ordered parts

- Experimental results
- Report
- Complete Documentation

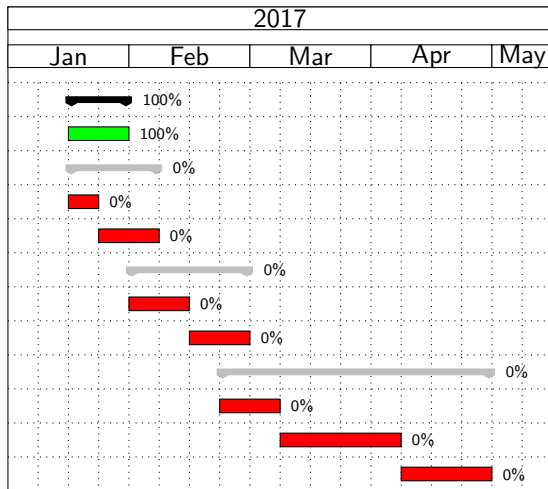
# Timeline and Milestones

Fall Semester



# Timeline and Milestones

Spring Semester











# Future Directions

- Estimate angle-of-arrival from wireless beacons
- Complete subsystems
- Integrate subsystems
- Demonstrate completed system

# References I

-  F. Martinelli, “A robot localization system combining rssi and phase shift in uhf-rfid signals,” *IEEE Transactions on Control Systems Technology*, vol. 23, no. 5, pp. 1782–1796, Sept 2015.
-  E. DiGiampaolo and F. Martinelli, “Mobile robot localization using the phase of passive uhf rfid signals,” *IEEE Transactions on Industrial Electronics*, vol. 61, no. 1, pp. 365–376, Jan 2014.
-  D. Song, C. Y. Kim, and J. Yi, “Simultaneous localization of multiple unknown and transient radio sources using a mobile robot,” *IEEE Transactions on Robotics*, vol. 28, no. 3, pp. 668–680, June 2012.
-  D. Hahnel, W. Burgard, D. Fox, K. Fishkin, and M. Philipose, “Mapping and localization with rfid technology,” in *Robotics and Automation, 2004. Proceedings. ICRA '04. 2004 IEEE International Conference on*, vol. 1, April 2004, pp. 1015–1020 Vol.1.

# References II

-  B. N. Hood and P. Barooah, “Estimating doa from radio-frequency rssi measurements using an actuated reflector,” *IEEE Sensors Journal*, vol. 11, no. 2, pp. 413–417, Feb 2011.
-  V. Malyavej, W. Kumkeaw, and M. Aorpimai, “Indoor robot localization by rssi/imu sensor fusion,” in *2013 10th International Conference on Electrical Engineering/Electronics, Computer, Telecommunications and Information Technology*, May 2013, pp. 1–6.