CSE-571 Robotics

Mapping

Some slides adapted from Dieter Fox, Cyrill Stachniss, and probabilistic-robotics.org

### **Fiducials: AR Tags**



## **Occupancy Grid Maps**

- Introduced by Moravec and Elfes in 1985
- Represent environment by a grid.
- Estimate the probability that a location is occupied by an obstacle.
- Key assumptions
  - Occupancy of individual cells is independent

$$Bel(m_t) = P(m_t | u_1, z_2 \Box, u_{t-1}, z_t)$$
$$= \prod_{x, y} Bel(m_t^{[xy]})$$

Robot positions are known!

### **Using Bayes:**

Log odds representation:

$$l_{t,i} = \log\left(\frac{p(m_i|z_{1:t}, x_{1:t})}{1 - p(m_i|z_{1:t}, x_{1:t})}\right)$$
$$l_{t,i} = l_{t-1,i} + \log\left(\frac{p(m_i|z_t, x_t)}{1 - p(m_i|z_t, x_t)}\right) - \log\left(\frac{p(m_i)}{1 - p(m_i)}\right)$$

## Incremental Updating of Occupancy Grids (Example)

Z	+		+		+	$\langle \mathbf{X} \rangle$		
	+		+	<u>(</u> )	+	<u>()</u>		
	+		+		+	<u>.</u>		
	+		+	.2)	+	2)		
	+	(ک	+	2)	+	<u>.</u>		
	+	2)	+	2)	+	2	$\rightarrow$	

## **Resulting Map Obtained with Ultrasound Sensors**





#### **Occupancy Grids:** From scans to maps







#### Tech Museum, San Jose





#### occupancy grid map

## **3D Map Requirements**

- Full 3D Model
  - Volumetric representation
  - Free-space
  - Unknown areas (e.g. for exploration)
- Updatable
  - Probabilistic model (sensor noise, changes in the environment)
  - Update of previously recorded maps
- Flexible
  - Map is dynamically expanded
  - Multi-resolution map queries
- Compact
  - Memory efficient
  - Map files for storage and exchange

#### Pointclouds

- Pro:
  - No discretization of data
  - Mapped area not limited



#### Contra:

- Unbounded memory usage
- No direct representation of free or unknown space

### 3D voxel grids

#### Pro:

- Probabilistic update
- Constant access time



#### Contra:

- Memory requirement
  - Extent of map has to be known
  - Complete map is allocated in memory

### 2.5D Maps

- 2D grid
- Height value(s) in each cell

Pro:

- Memory efficient
- Contra:
  - Not completely probabilistic
  - No distinction between free and unknown space



Octrees

- Tree-based data structure
- Recursive subdivision of space into octants
- Volumes allocated as needed
- Multi-resolution





#### Octrees

#### Pro:

- Full 3D model
- Probabilistic
- Flexible, multi-resolution
- Memory efficient
- Contra:
  - Implementation can be tricky



## **OctoMap Framework**

- Based on octrees
- Probabilistic representation of occupancy including unknown
- Supports multi-resolution map queries
- Lossless compression

 Open source implementation as C++ library available at http://octomap.sf.net

### **Examples**

#### Cluttered office environment





#### Map resolution: 2 cm

## **Examples: Office Building**

#### Freiburg, building 079



### **Examples: Large Outdoor Areas**

- Freiburg computer science campus
  - (292 x 167 x 28 m<sup>3</sup>, 20 cm resolution)



## **OctoMap Implementation**

- Open source C++ library
- Fully documented
- Can be easily adapted to your projects
- ROS integration
- Includes OpenGL viewer
- Already used by several other researchers

#### http://octomap.sf.net