

# Introduction to Cognitive Robotics

## Module 3: Mobile Robots

Lecture 1: Types of mobile robots; locomotion vs. navigation;  
challenges of navigation: localization; search, path planning, coverage, SLAM

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# Types of Mobile Robots

Wheeled  
transport robot




## Picker Robots

Picker Robots are mobile machines designed to autonomously retrieve and carry products in a warehouse. The robots are directed through AI-powered software that identifies the most efficient paths for them to pick, replenish, return, and count goods.

**CREATOR**

inVia Robotics [↗](#)

**COUNTRY**

United States 

**YEAR**

2015

**TYPE**

Industrial

Source: <https://robots.ieee.org/robots/invia/>



Video

# Types of Mobile Robots

Wheeled  
transport robot




## Freight

Freight is an autonomous mobile base for use in warehouses to transport materials from point A to point B. The robot platforms come in three zippy flavors – 100, 500 and 1500, all of which represent the payload it can handle in kilograms.

**CREATOR**

Fetch Robotics [↗](#)

**COUNTRY**

United States 

**YEAR**

2014

**TYPE**

Industrial

Source: <https://robots.ieee.org/robots/freight/>

# Types of Mobile Robots

## Wheeled telepresence robot




## Beam

Beam is a telepresence robotic system that can "teleport" you to a remote location, allowing you to move around and interact with people. It is easy to drive and has a large display to improve face-to-face, or screen-to-face, communication.

### CREATOR

Suitable Technologies [↗](#)

### COUNTRY

United States 

### YEAR

2011

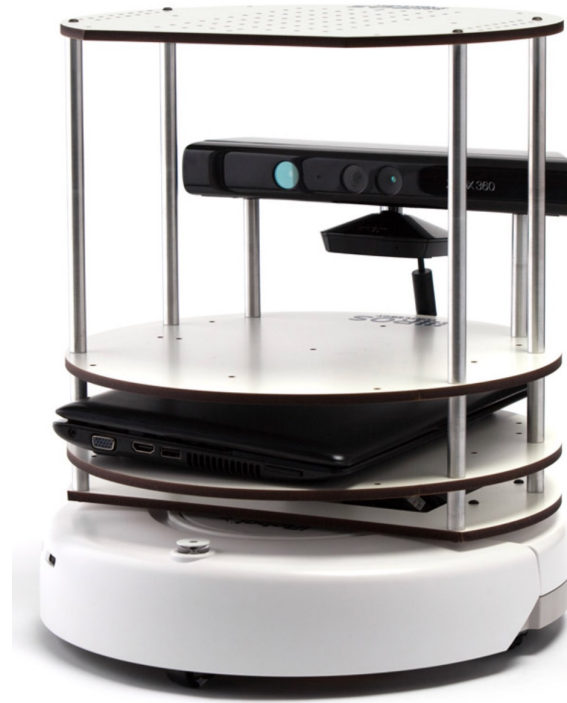
### TYPE

Telepresence, Consumer

Source: <https://robots.ieee.org/robots/beam/>

# Types of Mobile Robots

Wheeled  
education robot




## TurtleBot

TurtleBot is a low-cost personal robot designed for hobbyists and researchers. It's open source, runs the ROS operating system, and combines a netbook with a Kinect 3D sensor and a mobile base.

**CREATOR**

Willow Garage [↗](#)

**COUNTRY**

United States 

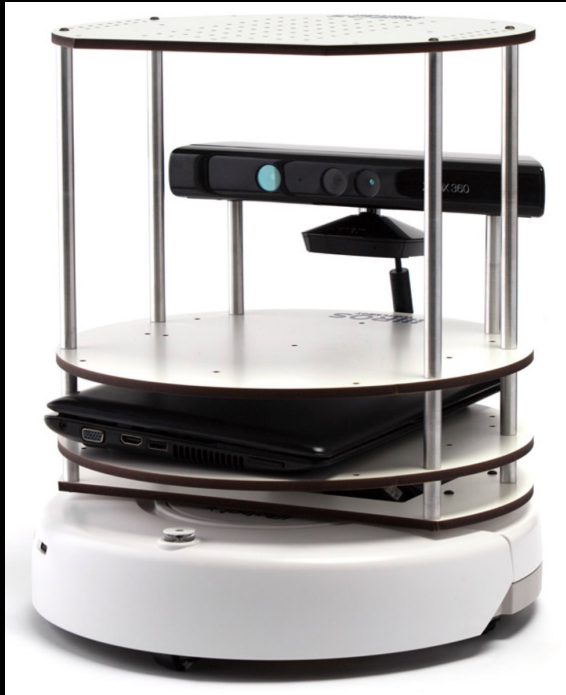
**YEAR**

2011

**TYPE**

Consumer, Research, Education

Source: <https://robots.ieee.org/robots/turtlebot/>

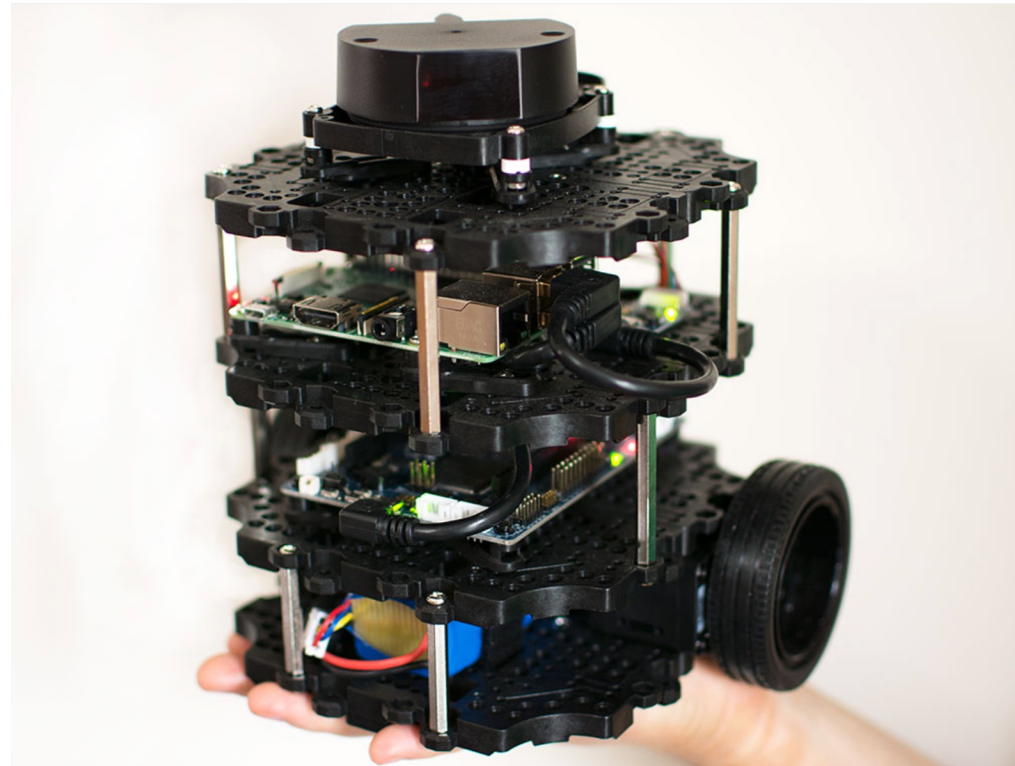


Video



# Types of Mobile Robots

Wheeled  
education robot



## TurtleBot 3

TurtleBot3 is a small programmable mobile robot powered by the Robot Operating System (ROS). It carries lidar and 3D sensors and navigates autonomously using simultaneous localization and mapping (SLAM).

**CREATOR**

Robotis and OpenRobotics [↗](#)

**COUNTRY**

South Korea 🇰🇷

**YEAR**

2017

**TYPE**

Research, Education

Source: <https://robots.ieee.org/robots/turtlebot3/>



# Types of Mobile Robots

Wheeled  
humanoid robot




## Armar

Armar is a robot created to be a helper in industrial environments. Its humanoid form lets it use human tools like power drills and hammers. Earlier versions were home helpers that could clean tables and load the dishwasher.

**CREATOR**

Karlsruhe Institute of Technology [↗](#)

**COUNTRY**

Germany 

**YEAR**

2017

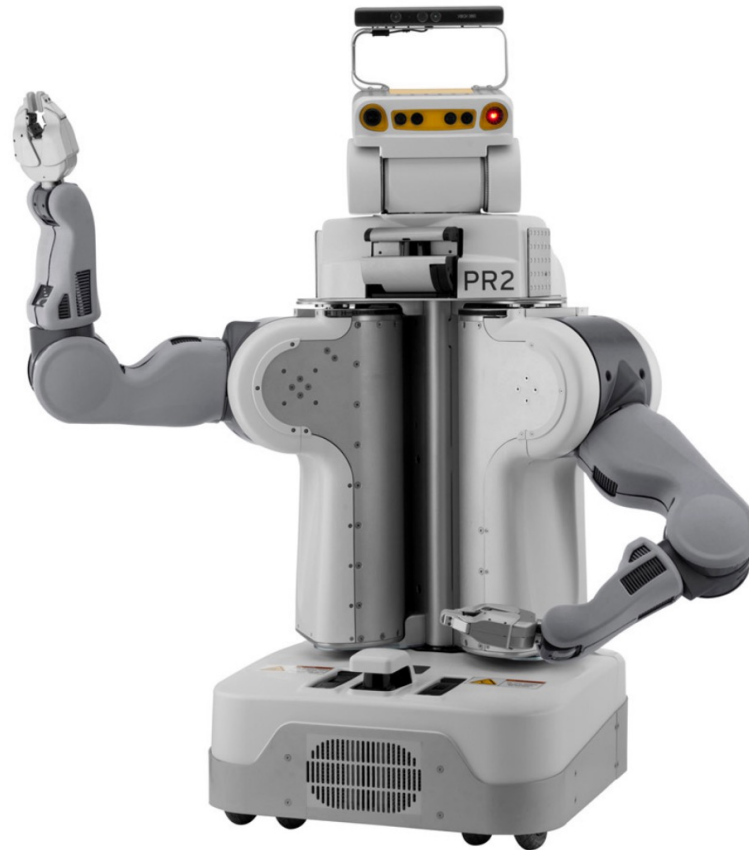
**TYPE**

Humanoids, Research

Source: <https://robots.ieee.org/robots/armar/>

# Types of Mobile Robots

Wheeled  
humanoid robot




## PR2

The PR2 is one of the most advanced research robots ever built. Its powerful hardware and software systems let it do things like clean up tables, fold towels, and fetch you drinks from the fridge.

**CREATOR**

Willow Garage [↗](#)

**COUNTRY**

United States 

**YEAR**

2010

**TYPE**

Research, Humanoids

Source: <https://robots.ieee.org/robots/pr2/>

# Types of Mobile Robots

Wheeled  
humanoid robot




## Pepper

Pepper is a friendly humanoid designed to be a companion in the home and help customers at retail stores. It talks, gesticulates, and seems determined to make everyone smile.

### CREATOR

SoftBank Robotics [↗](#)  
(originally created by Aldebaran Robotics, acquired by SoftBank in 2015)

### COUNTRY

Japan 

### YEAR

2014

### TYPE

Humanoids, Consumer, Entertainment

Source: <https://robots.ieee.org/robots/pepper/>

# Types of Mobile Robots


Legged  
humanoid robot




## Nao

Nao is a small humanoid robot designed to interact with people. It's packed with sensors (and character) and it can walk, dance, speak, and recognize faces and objects. Now in its sixth generation, it is used in research, education, and healthcare all over the world.

### CREATOR

SoftBank Robotics   
(originally created by Aldebaran Robotics, acquired by SoftBank in 2015)

### COUNTRY

France 

### YEAR

2008

### TYPE

Humanoids, Research, Education

Source: <https://robots.ieee.org/robots/nao/>

# Types of Mobile Robots

Legged  
humanoid robot



## HRP-4

HRP-4 is one of the world's most advanced humanoids, the culmination of a decade of R&D. It's designed to collaborate with humans and can perform remarkably natural, human-like movements.

**CREATOR**

Kawada Industries and AIST [↗](#)

**COUNTRY**

Japan 🇯🇵

**YEAR**

2010

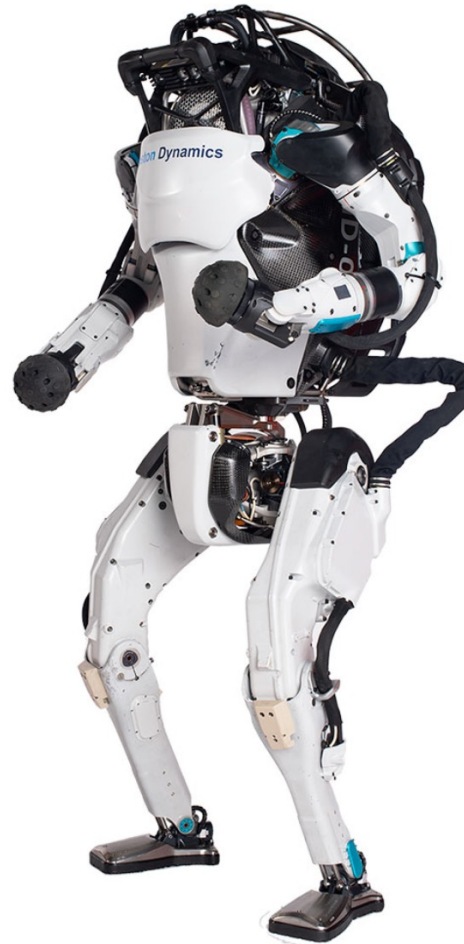
**TYPE**

Humanoids, Research

Source: <https://robots.ieee.org/robots/hrp4/>

# Types of Mobile Robots

Legged  
humanoid robot



## Atlas

Atlas is the most agile humanoid in existence. It uses whole-body skills to move quickly and balance dynamically. It can lift and carry objects like boxes and crates, but its favorite tricks are running, jumping, and doing backflips.

**CREATOR**

Boston Dynamics [↗](#)

**COUNTRY**

United States 

**YEAR**

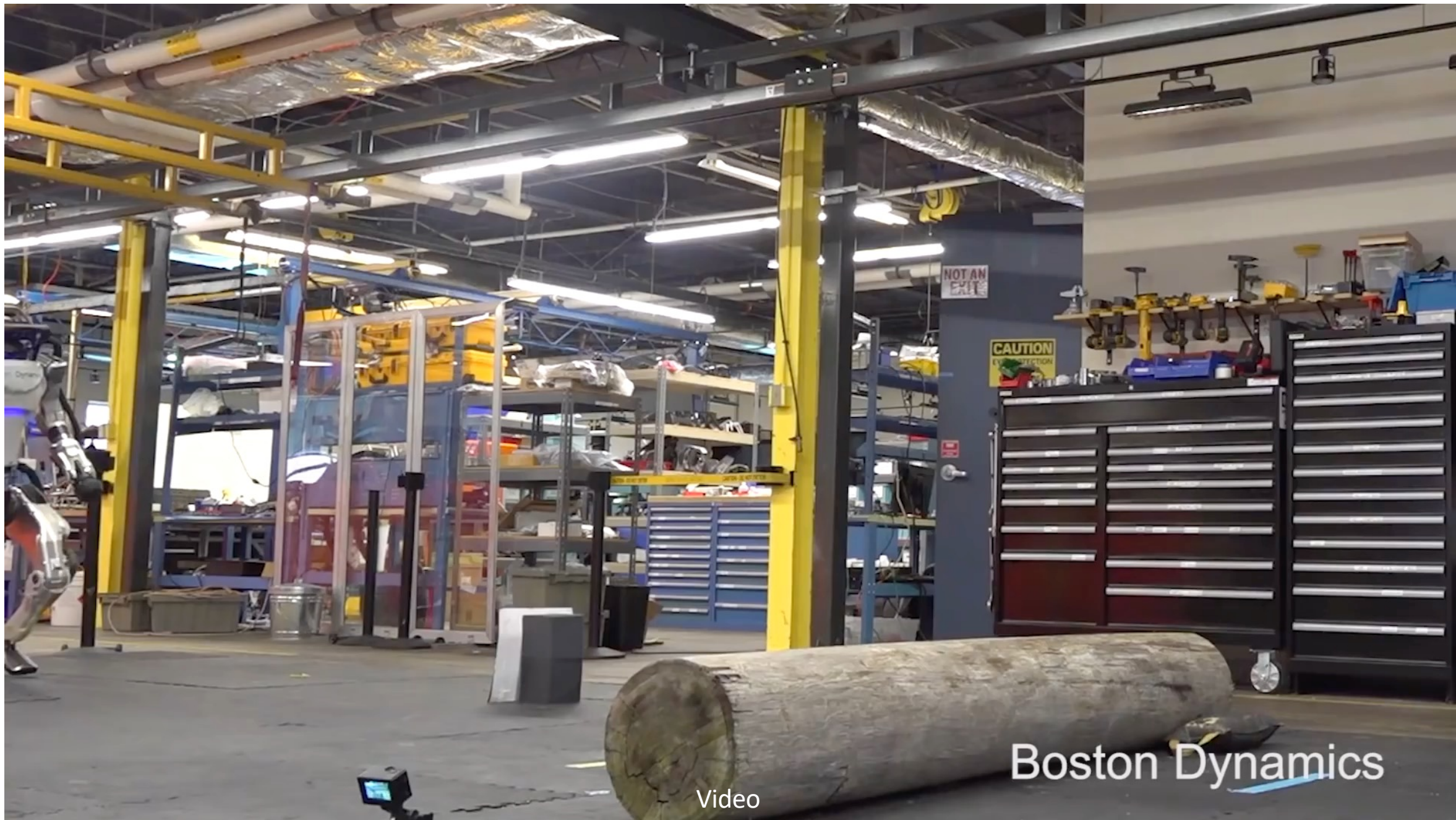
2016

**TYPE**

Humanoids, Industrial

Source: <https://robots.ieee.org/robots/atlas2016/>





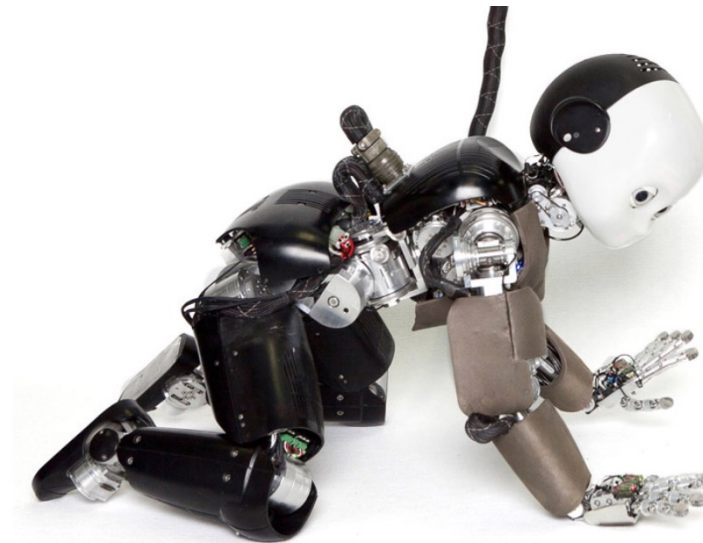
Boston Dynamics

Video



# Types of Mobile Robots

Legged  
humanoid robot



## iCub

iCub is a child-size humanoid robot capable of crawling, grasping objects, and interacting with people. It's designed as an open source platform for research in robotics, AI, and cognitive science.

**CREATOR**

RoboCub Consortium and IIT [↗](#)

**COUNTRY**

Italy 

**YEAR**

2004

**TYPE**

Humanoids, Research

Source: <https://robots.ieee.org/robots/icub/>

# Types of Mobile Robots

Legged  
inspection robot




## ANYmal

ANYmal is a rugged, autonomous four-legged robot designed for inspection and manipulation tasks. It uses sensors to scan the terrain and avoid obstacles, and can operate in rain, snow, wind, waterlogged rooms, and dusty environments.

**CREATOR**

ETH Zurich and ANYbotics [↗](#)

**COUNTRY**

Switzerland 

**YEAR**

2016

**TYPE**

Industrial, Research, Disaster Response

Source: <https://robots.ieee.org/robots/anymal/>

# Types of Mobile Robots

Legged  
transport robot




## AlphaDog

AlphaDog is a quadruped robot the size of a mule (a big, mean mule). It's powered by a hydraulic actuation system and is designed to assist soldiers in carrying heavy gear over rough terrain.

**CREATOR**

Boston Dynamics [↗](#)

**COUNTRY**

United States 

**YEAR**

2011

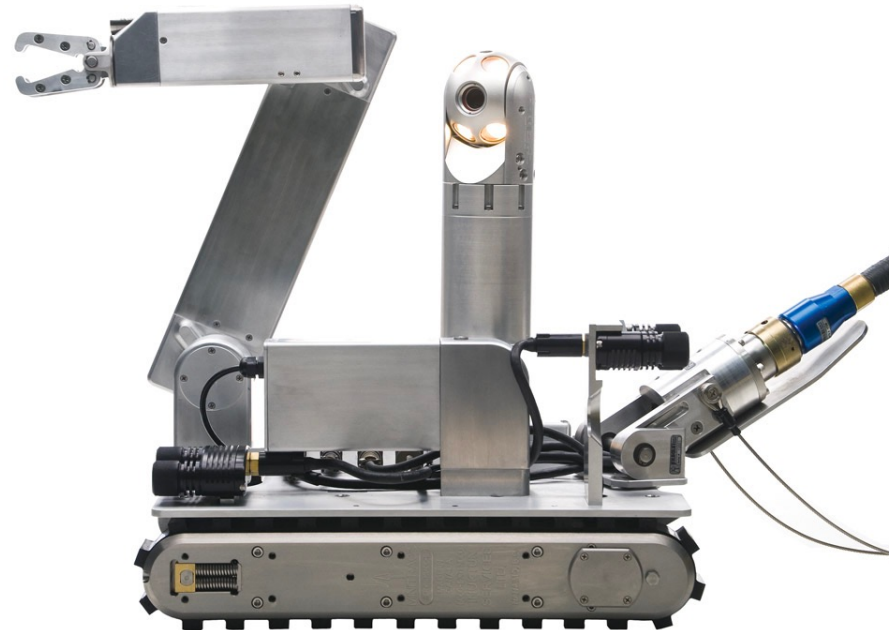
**TYPE**

Military & Security, Research

Source: <https://robots.ieee.org/robots/alphadog/>

# Types of Mobile Robots

Tracked  
transport robot




## Versatrax

Versatrax 450 TTC is a mobile robot designed for hazardous environments. It allows users to locate, inspect, and safely remove dangerous materials from any site faster than by conventional means.

**CREATOR**

Inuktun Services [↗](#)

**COUNTRY**

Canada 

**YEAR**

2012

**TYPE**

Industrial, Military & Security, Disaster Response

Source: <https://robots.ieee.org/robots/inuktun/>



# Types of Mobile Robots


Tracked  
disaster response robot




## Kobra

Kobra is a rugged, remote control robot designed to search for explosives and carry out reconnaissance missions. It rolls on tank-like treads, and its manipulator arm can lift heavy payloads.

### CREATOR

Endeavor Robotics   
(Originally created by iRobot)

### COUNTRY

United States 

### YEAR

2011

### TYPE

Military & Security, Disaster Response

Source: <https://robots.ieee.org/robots/kobra/>

# Types of Mobile Robots

Airborne  
delivery robot



## Zipline

Zipline is an autonomous fixed-wing aircraft drone used to carry blood and medicine from a distribution center to wherever it's needed. It can launch within minutes, and travel in any weather.

**CREATOR**

Zipline [↗](#)

**COUNTRY**

United States 

**YEAR**

2016

**TYPE**

Drones, Medical

Source: <https://robots.ieee.org/robots/zipline/>



Video





Video



Video

# Types of Mobile Robots

Airborne  
surveillance robot




## Global Hawk

The Global Hawk is an unmanned aerial vehicle that's used for high-altitude, long-duration surveillance. You tell it what to do, and it can take off, fly, spy, and return without any human input.

**CREATOR**

Northrop Grumman [↗](#)

**COUNTRY**

United States 

**YEAR**

2001

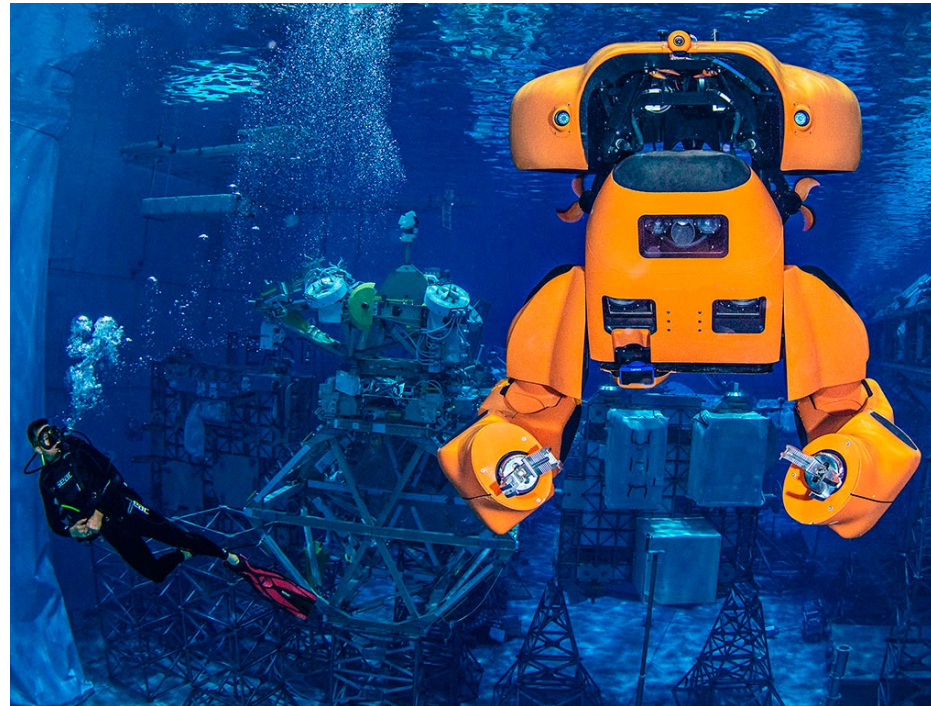
**TYPE**

Aerospace, Military & Security, Drones

Source: <https://robots.ieee.org/robots/globalhawk/>

# Types of Mobile Robots

Underwater  
manipulation &  
inspection robot




## Aquanaut

Aquanaut is an unmanned underwater vehicle that can transform itself from a nimble submarine designed for long-distance cruising into a half-humanoid robot capable of carrying out complex manipulation tasks. It can inspect subsea oil and gas infrastructure, operate valves, and use tools.

**CREATOR**

Houston Mechatronics Inc. [↗](#)

**COUNTRY**

United States 

**YEAR**

2019

**TYPE**

Underwater, Industrial

Source: <https://robots.ieee.org/robots/aquanaut/>

# Navigation is Hard

"Getting from one place to another is remarkably challenging for a robot.

...

Getting any body part where it needs to be is hard, and the more complicated the robot's body, the harder the problem."

M. Mataric, The Robotics Primer, MIT Press, 2007

# Locomotion vs. Navigation

## Locomotion

- How to **control the mobile robot motors** so that the robot moves towards some **well-specified target location**
- How to **control the mobile robot motors** so that the robot moves along some **well-defined path or trajectory**

## Navigation

- How to determine the strategy required to get from one point in the environment to another by **planning an effective and efficient path**



# Locomotion vs. Navigation

## Locomotion

- Following an arbitrary given path or trajectory is harder than having to get to a particular destination by using any path
  - Some paths are impossible to follow for some robots because of their holonomic constraints
  - For others, some paths can be followed, but only if the robot is allowed to stop, change directions (in place or otherwise), and then go again
- A large subarea of robotics research deals with enabling robots to follow arbitrary trajectories.



# Locomotion vs. Navigation

## Locomotion

- Trajectory planning, also called **motion planning**, is a computationally complex process
  - Involves searching through all possible trajectories and evaluating the to find one that will satisfy the requirements
  - Depending on the task, it may be necessary to find the very best (shortest, safest, most efficient, etc.), so-called optimal trajectory
- Since robots are not just points, we need to take into account their
  - Geometry (shape, turning radius)
  - Steering mechanism (holonomic properties)

# Locomotion vs. Navigation

## Locomotion

- Trajectory planning is used in
  - Mobile robots, in two dimensions
  - Robot arms, in three dimensions, where the problem becomes even more complex
- Depending on their task, practical robots may not be so concerned with following specific trajectories as with just getting to the goal location
- The ability to get to the goal is quite a different problem from **planning a particular path** and is called **navigation**

# Challenges of Robot Navigation

## The goal of navigation

- To reach a given location P
- Examples
  - Go to  $[x = 100, y = 200, \theta = 90]$  ← Which frame of reference?
  - Go to room T 2224 ← Where is this room?
  - Go to the cafeteria ← Where is the cafeteria? Where in the cafeteria?
  - Go to the city centre ← Where is the city centre? Which city?
  - Go to a good observation position ← For observing what? What is a criterion for "good"?

# Challenges of Robot Navigation

## The goal of navigation

- To reach a given location P
- Possible ways to complicate the problem
  - Go to P in shortest time [optimal control]
  - Go to P with least energy [optimal control]
  - Go to P with max speed 1 m/s [constraints]
  - Be at P at 4:12 pm [deadlines]

# Challenges of Robot Navigation

## Facets of the navigation problem

- Get a map of the environment
- Make a navigation plan using this map
- Execute the plan
  - **move** in a stable and safe way
  - **keep track of your position** in the map
  - **detect** and avoid obstacles and dangers
  - **notice** exceptional situations and **modify the plan**
- All this needs the use of sensors

# Challenges of Robot Navigation

## Environment map

- Must include **topological** information

A topological map:  
a graph or network of  
connected locations

Which aisles are blocked and which provide a connection?

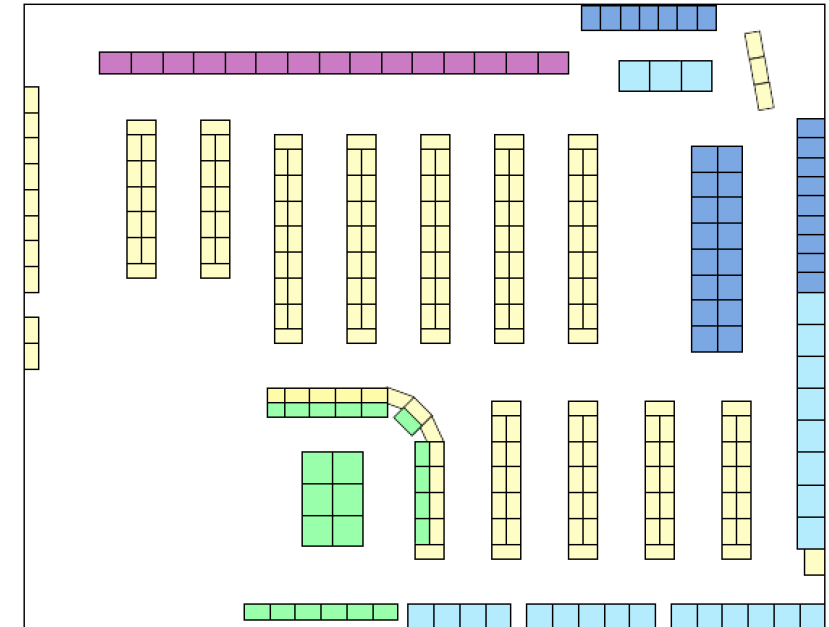
- Must include **geometric** information

A metric map,  
showing locations and  
distances between  
locations

How many meters to travel before turning left?

- The problem is to find the right level of detail

- Too abstract  $\Rightarrow$  insufficient information to be useful
- Too detailed  $\Rightarrow$  too much information for stable navigation



Map recreated from the following papers:

Joho, D., Senk, M., & Burgard, W. (2009). Learning wayfinding heuristics based on local information of object maps. Proceedings of the European Conference on Mobile Robots (ECMR) 2009, 117–122.

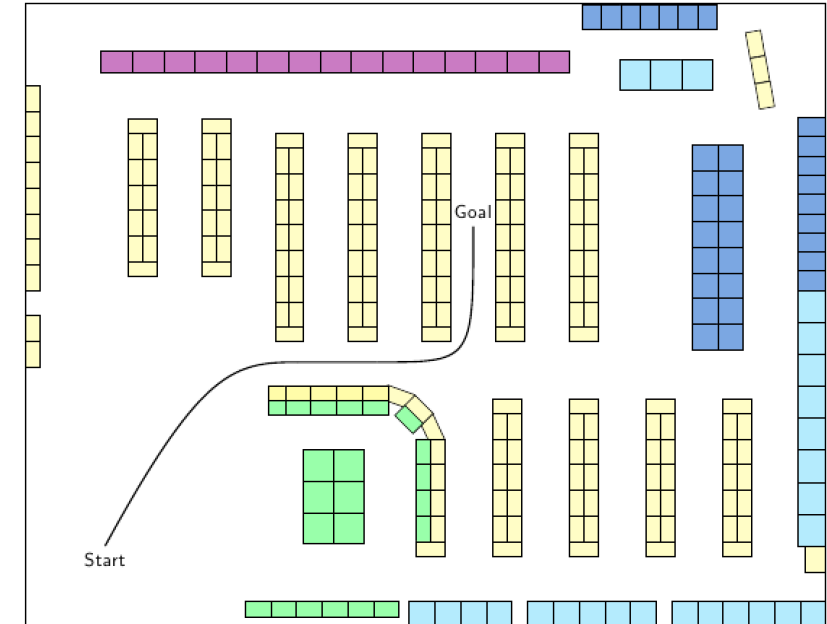
Kalff, C., & Strube, G. (2009). Background knowledge in human navigation: a study in a supermarket. Cognitive Processing, 10(2), 225–228.

# Challenges of Robot Navigation

## Planning

- Find a path in the map that
  - Goes from the **start** position to the **goal** position
  - Is **collision-free**
  - Is **feasible** given the robot's **kinematics** and **dynamics**
  - **Satisfies** the extra **constraints**
- Problem: **uncertainty**

In real environments, the configuration of the space may not be fully known in advance and may change at any point

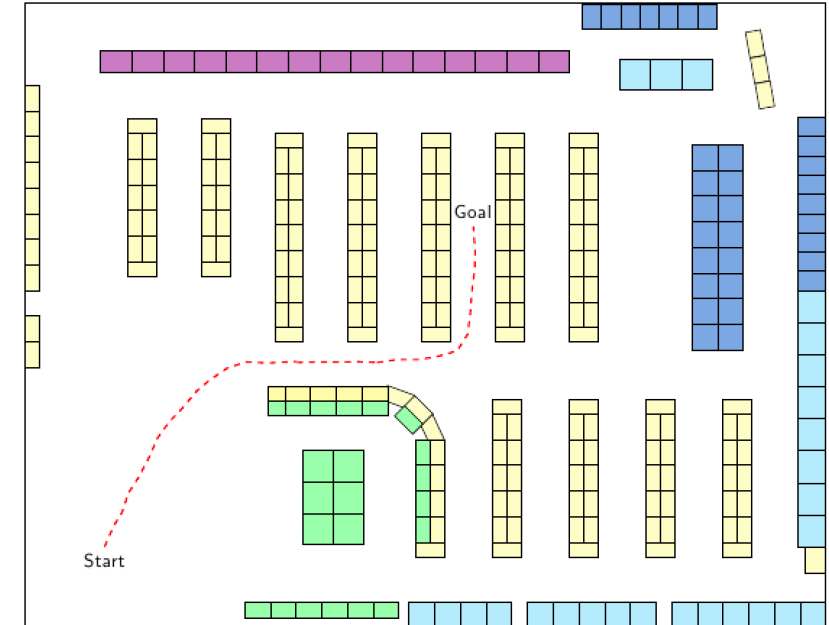




# Challenges of Robot Navigation

## Execution

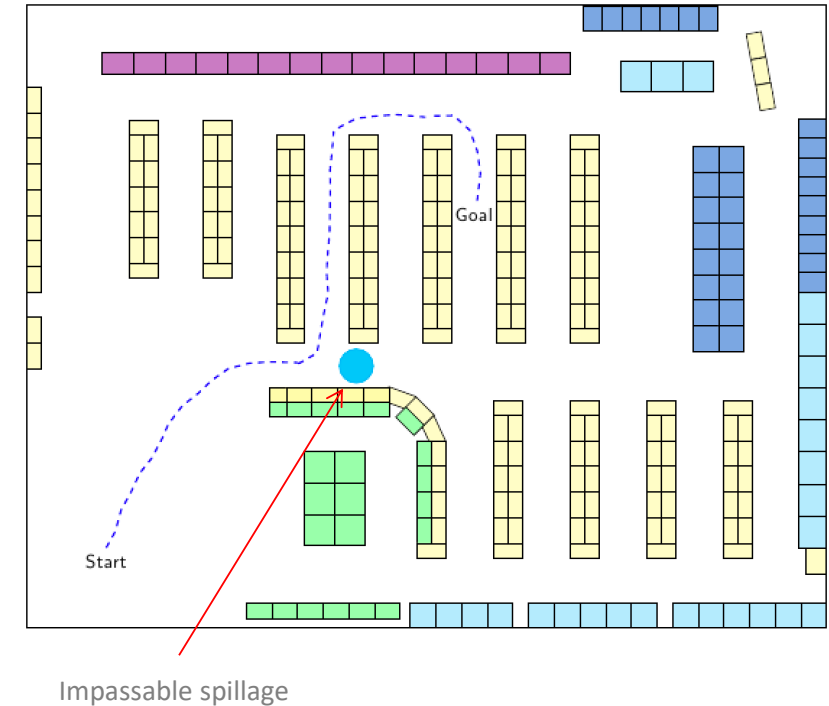
- Follow the planned trajectory
  - Guarantee physical stability
  - Keep track of your position in the map
- React to unexpected events
  - Use sensors to detect obstacles
  - Use sensors to detect failures in the plan
- Problem: **uncertainty**
  - Sensor data may be noisy
  - Locomotion may be imperfect



# Challenges of Robot Navigation

## Re-planning

- Detect major discrepancies from the plan
  - the plan is not feasible anymore, or
  - there is a new better opportunity
- Modify the plan
- **Problem:** when to re-plan?
  - we want to react quickly to any new situation, but we do not want to change our mind all the time




# Challenges of Robot Navigation

## Components of the navigation problem

- Localization: finding out where you are
- Search: looking for the goal location (or target object)
- Path planning: planning a path to the goal location
- Coverage: ensuring the search strategy covers all the possibilities when looking for the goal location.
- SLAM: localization and constructing a map at the same time

Either with a map or without a map



"This is a 'chicken or egg' problem: to make a map, you have to know where you are, but to know where you are, you have to have a map. With SLAM, you have to do both at the same time." M. Mataric.

# Types of Robot

## Consumer



## Roomba

Roomba is an autonomous vacuum and one of the most popular consumer robots in existence. It navigates around clutter and under furniture cleaning your floors, and returns to its charging dock when finished.

**CREATOR**

iRobot 

**COUNTRY**

United States 

**YEAR**

2002

**TYPE**

Consumer

Source: <https://robots.ieee.org/robots/roomba/>

# Video

<https://robots.ieee.org/robots/roomba/?gallery=video2>

# Types of Robot

Education



## Roomba

Roomba is an autonomous vacuum and one of the most popular consumer robots in existence. It navigates around clutter and under furniture cleaning your floors, and returns to its charging dock when finished.

### CREATOR

iRobot 

### COUNTRY

United States 

### YEAR

2002

### TYPE

Consumer

Source: <https://robots.ieee.org/robots/roomba/>




# Challenges of Robot Navigation

## Components of the navigation problem

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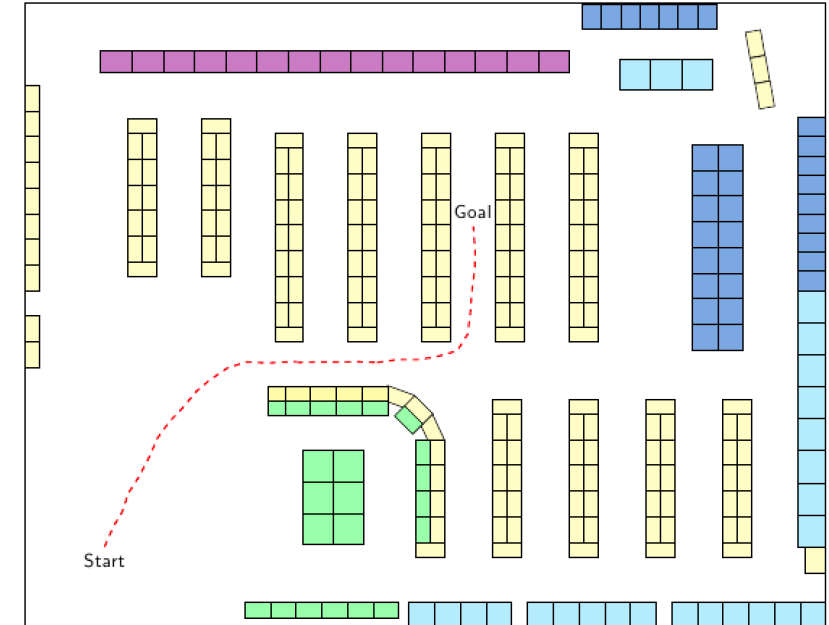
# Localization: The Position Estimation Problem

Robot must keep track of its position in the map

- in order to **plan** a trajectory to the goal
- in order to **follow** the planned trajectory

This gives rise to the **Position Estimation Problem**

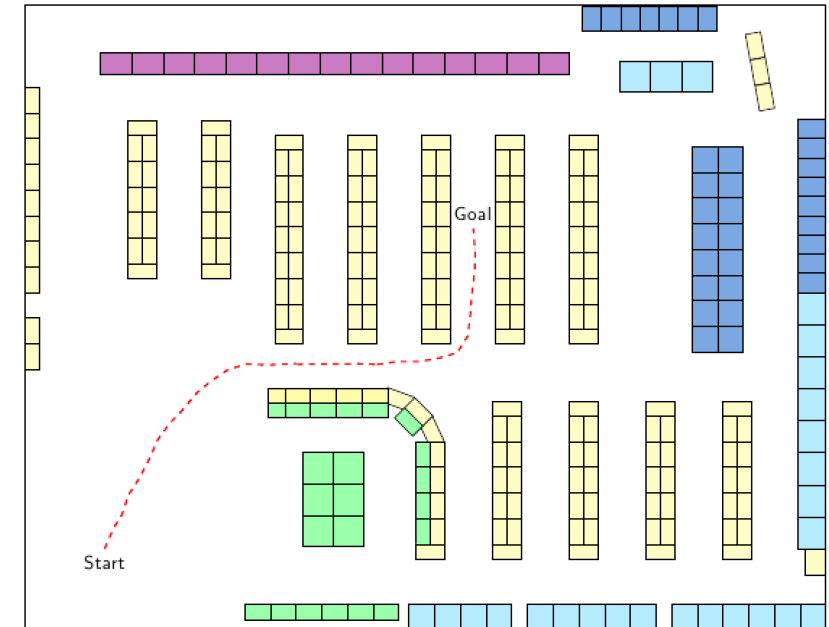
- establish the position of the robot in the environment
- use both **proprioceptive** and **exteroceptive** sensors



# Localization: The Position Estimation Problem

Two approaches

1. **Absolute** position estimation
2. **Relative** position estimation



# Reading

M. Mataric, The Robotics Primer, MIT Press, 2007. Chapters 5 and 19.

# Videos

Daniel Wolpert's TED Talk on the real reason for brains <https://www.youtube.com/watch?v=7s0CpRfyYp8>