

Final Exam Review



Dr. Matuszek



Main Concerns

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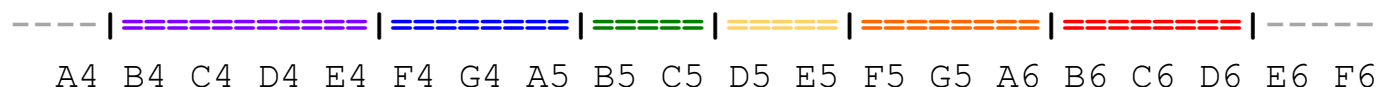
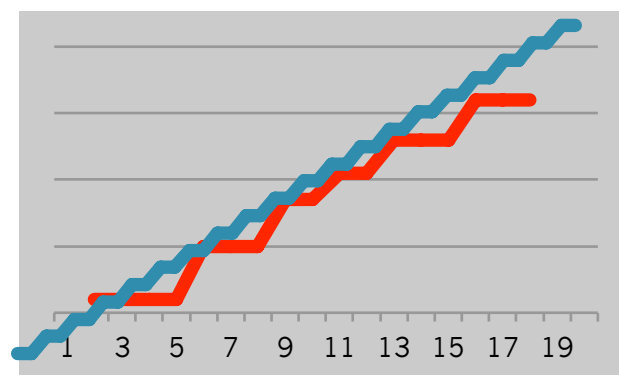
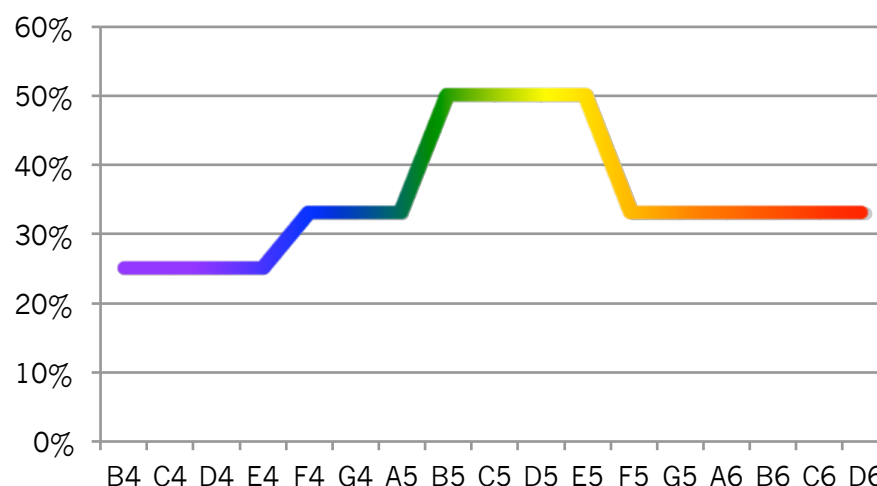
- ◆ What kinds of questions will I ask?
 - ◆ Conceptually
 - ◆ Pragmatically
- ◆ What topics will be on the exam?

Types of Questions

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- ◆ What Will I Ask?
- ◆ Multiple-choice, short answer, image-based
- ◆ Synthesis, e.g.:
 - ◆ What's the purpose of something?
 - ◆ How would you solve the following problem?
 - ◆ Examples:

See: Q2 #1, Q3 #10, #14, Q4 #8, #17





Topics

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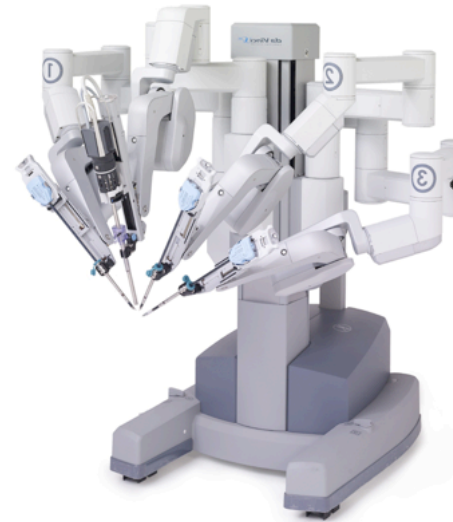
- ◆ What's a Robot?
- ◆ Sensing
- ◆ Uncertainty
- ◆ Actuators
- ◆ Control software
- ◆ Motors/motor control
- ◆ Locomotion
- ◆ Manipulation
- ◆ Kinematics
- ◆ Localization
- ◆ Motion planning
- ◆ Machine learning
- ◆ Cognition
- ◆ Human-robot interaction

What's a Robot?

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- ◆ Overview and Concepts
 - ◆ What is a robot?



- ◆ Autonomous?
 - ◆ Physical?
 - ◆ Human-friendly?
 - ◆ Humanoid?
 - ◆ Sensory?
 - ◆ Intelligent?
 - ◆ Mobile?
 - ◆ Manipulative?
 - ◆ What else?
- ◆ Won't ask explicitly –be able to discuss intelligently



What Are They Good For?

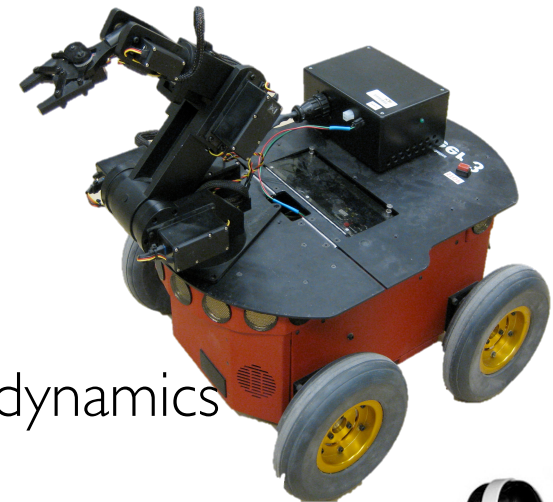
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- ◆ Now
 - ◆ Factories (how?)
 - ◆ Industrial automation (mining, harvesting, warehouses, ...)
 - ◆ Surgery, vacuuming, surveillance, military, space
 - ◆ Homes: Toys, vacuuming, driving
- ◆ Future?
 - ◆ More of the above, plus:
 - ◆ Hazardous environments (space, underwater, battlefields, ...)
 - ◆ Complex household tasks
 - ◆ Human-robot interaction

What Subsystems Are There?

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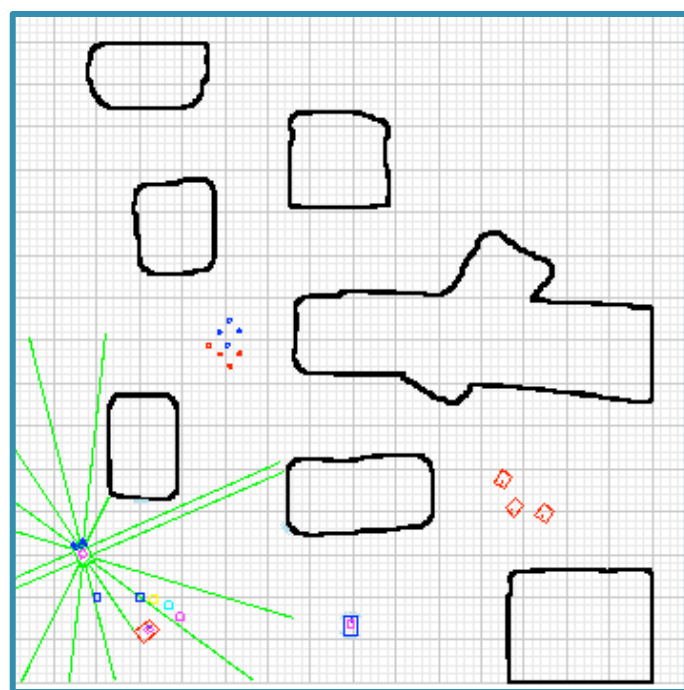
- ◆ Sensing
 - ◆ Perceiving the world
- ◆ Actuation
 - ◆ Doing something in the (physical) world
 - ◆ Mobility, manipulation
- ◆ Control
 - ◆ Navigation, motion planning, kinematics, dynamics
- ◆ Autonomy/Planning
- ◆ Interfaces (but we didn't really do this)



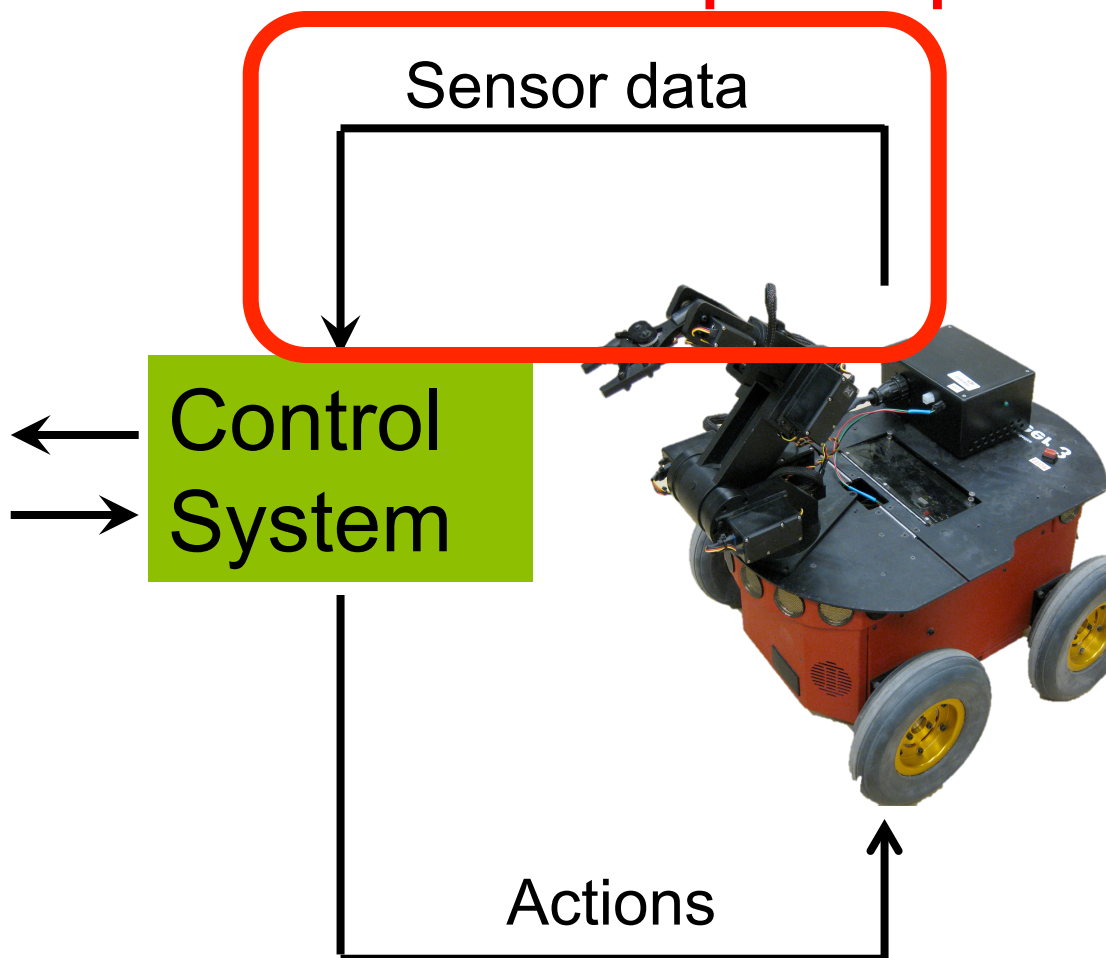
Very High Level View

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Without this: “open loop”



World Model





Mobility: Rolling

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- ◆ Maneuverability vs Control
- ◆ Wheels and Wheel Arrangements
- ◆ Walking vs. Rolling vs. Other
- ◆ Flying
 - ◆ Scaling and Lift
- ◆ Other: snake movement, jumping, ...



Mobility: Terminology

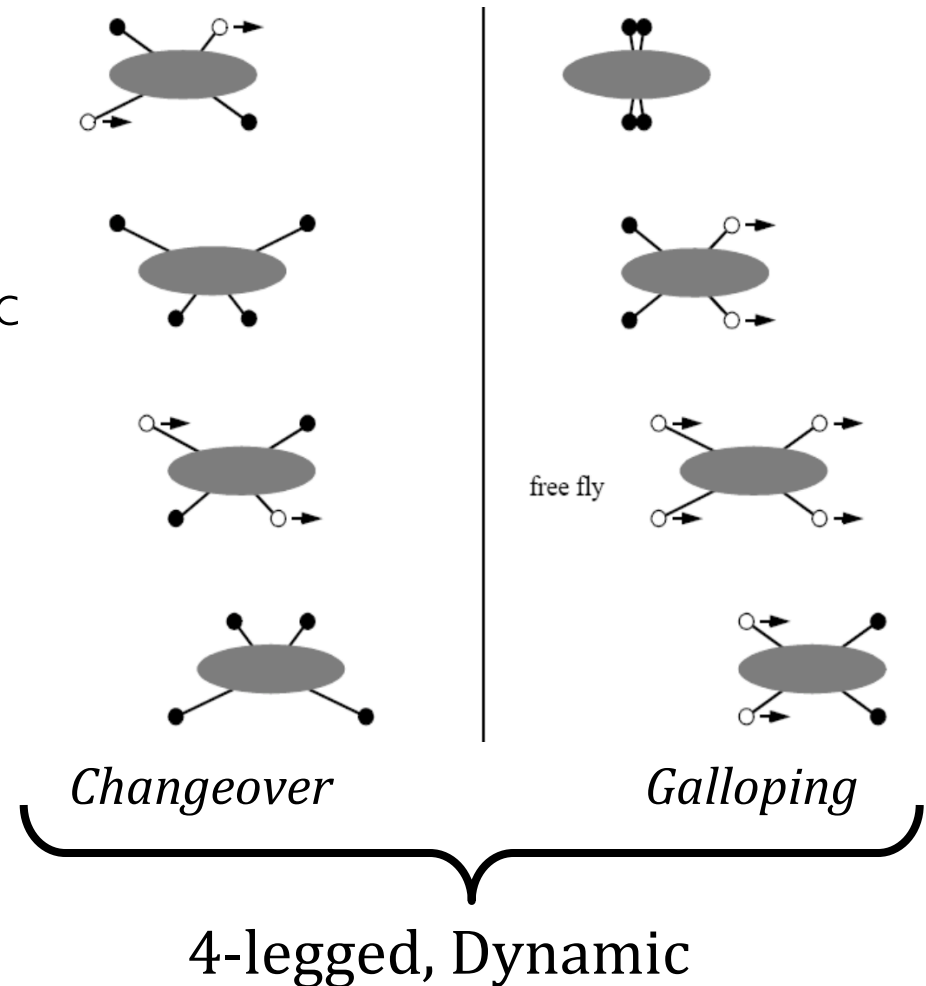
10

- ◆ Degrees of Freedom
- ◆ Compliance
 - ◆ Give when pushed back on
 - ◆ Related to safety
- ◆ Slip
 - ◆ Motor slip: motor turns, joint doesn't move
 - ◆ Locomotive slip: slipping/skidding on floor
- ◆ Back-drive
 - ◆ Whether it breaks when moved in reverse
 - ◆ Different from compliance

Mobility: Legged

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- ◆ Gaits
 - ◆ What is a gait? Sequence of feet up and down
 - ◆ Static (always stable), dynamic (stable while moving)
- ◆ Walking
- ◆ Constructions (How many legs? Why?)
- ◆ Active vs Passive Walking

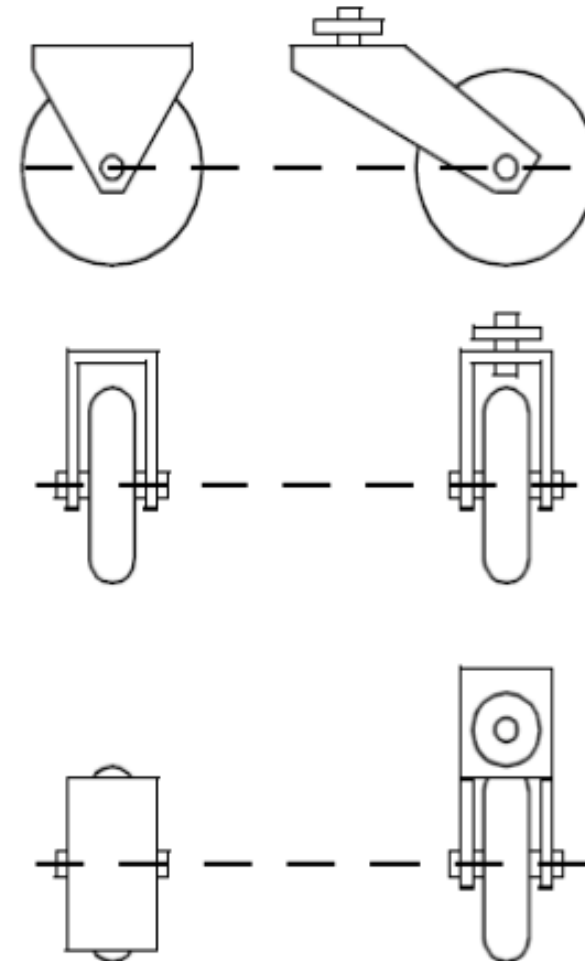


Mobility: Rolling

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- ◆ Types of wheels
 - ◆ Standard
 - ◆ Castor
 - ◆ Omni (several types)

Mounting axis Direction of rotation
 Axle Direction of translation



Adapted from © R. Siegwart, ETH Zürich – ASL

Sensors



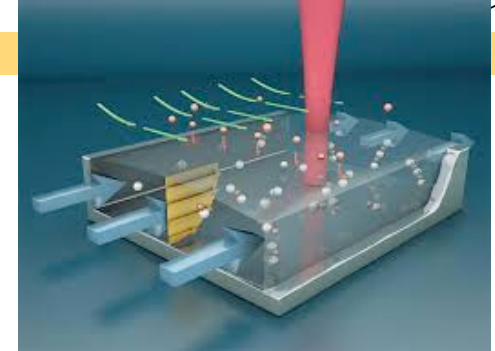
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- ◆ Perceive the world
 - ◆ **Passive sensors** capture signals generated by environment.
 - ◆ Background, lower power. E.G.: cameras.
 - ◆ **Active sensors** probe the environment. Explicitly triggered,
 - ◆ More info, higher power consumption. Example: lidar
- ◆ What are they sensing?
 - ◆ The **environment**: e.g. range finders, obstacle detection
 - ◆ The robot's **location**: e.g., gps, wireless stations
 - ◆ Robot's **internals**: joint encoders
- ◆ Proprioception: internal state

Some Typical Sensors

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- ◆ Optical
 - ◆ Laser, 3D, RGB(D)
- ◆ Pressure, temperature, chemical
- ◆ Motion & Accelerometer
- ◆ Acoustic
 - ◆ Sonar, ultrasonic
- ◆ E-field Sensing
- ◆ Range-finding
- ◆ Encoders



Sensors: Characterization

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Types of Sensors:

- ◆ Active / Passive
- ◆ Proprioceptive / Exteroceptive
- ◆ Incremental / Absolute

Characteristics of Sensors:

- ◆ Range
- ◆ Resolution
- ◆ Dynamic Range
- ◆ Linearity
- ◆ Bandwidth
- ◆ Sensitivity



Sensors: Error

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- ◆ Precision and Recall
- ◆ Accuracy
- ◆ Systematic error → deterministic failures
 - ◆ Caused by factors that can (in theory) be modeled
 - ◆ Can it be calibrated out?
- ◆ Random error → non-deterministic failures
 - ◆ No modeling or prediction possible
 - ◆ However, can be *described* probabilistically

Sensors: Error and Accuracy

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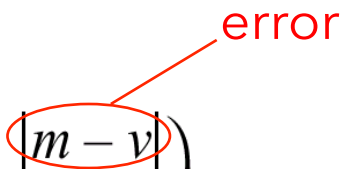
- ◆ Error
 - ◆ Difference between sensor output and true value

$$error = m - v \quad \begin{cases} m = \text{measured value} \\ v = \text{true value} \end{cases}$$

- ◆ Accuracy: unitless measure

$$\left(accuracy = 1 - \frac{|m - v|}{v} \right)$$

error

A red oval highlights the absolute difference |m - v| in the numerator of the accuracy formula. A red arrow points from the word "error" to this oval.



Precision (But Not Recall)

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- ◆ Precision
 - ◆ Reproducibility of sensor results
- ◆ A distribution of error can be characterized by:
 - ◆ Mean error: μ
 - ◆ Standard deviation: σ
 - ◆ How similar are two outputs from same test?
 - ◆ Same sensor, same environment ...

$$precision = \frac{range}{\sigma}$$

- ◆ Has other meanings in actuation *and* cognition

Uncertainty

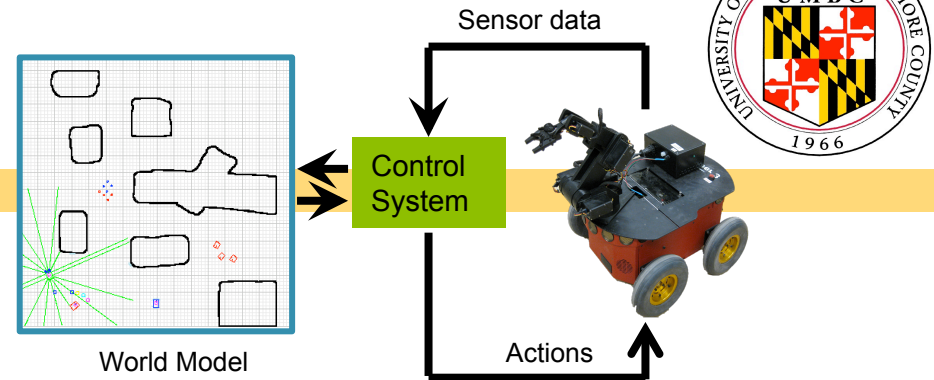
19

- ◆ Models are imperfect!
- ◆ Probability as uncertainty
- ◆ Key: explicit representation of uncertainty using probability theory

Perception = state estimation

Action = utility optimization

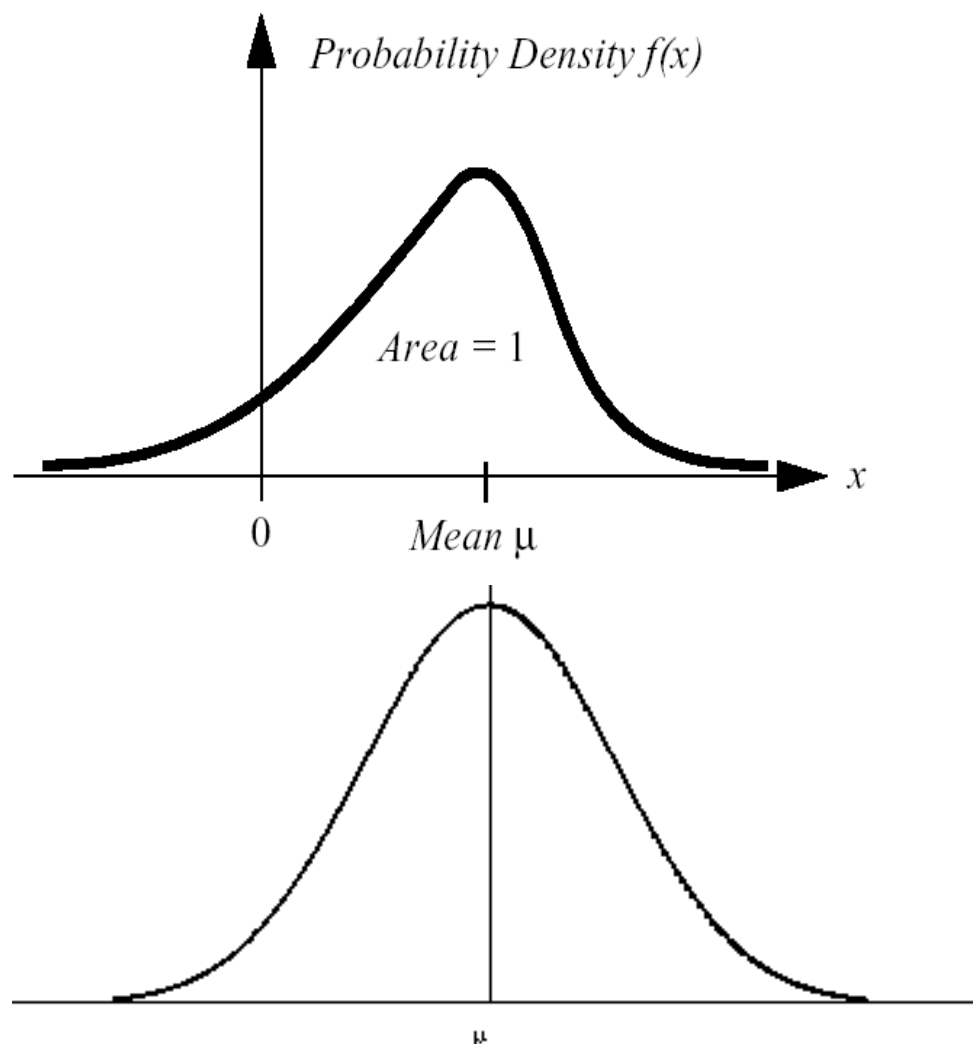
- ◆ Discrete and continuous probability
- ◆ Joint and marginal probability
- ◆ Utility functions



Error Distributions

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- ◆ Simplifying assumptions:
- ◆ Zero-mean error
- ◆ Unimodal distribution
- ◆ Symmetric distribution
- ◆ Gaussian distribution





Error and Uncertainty

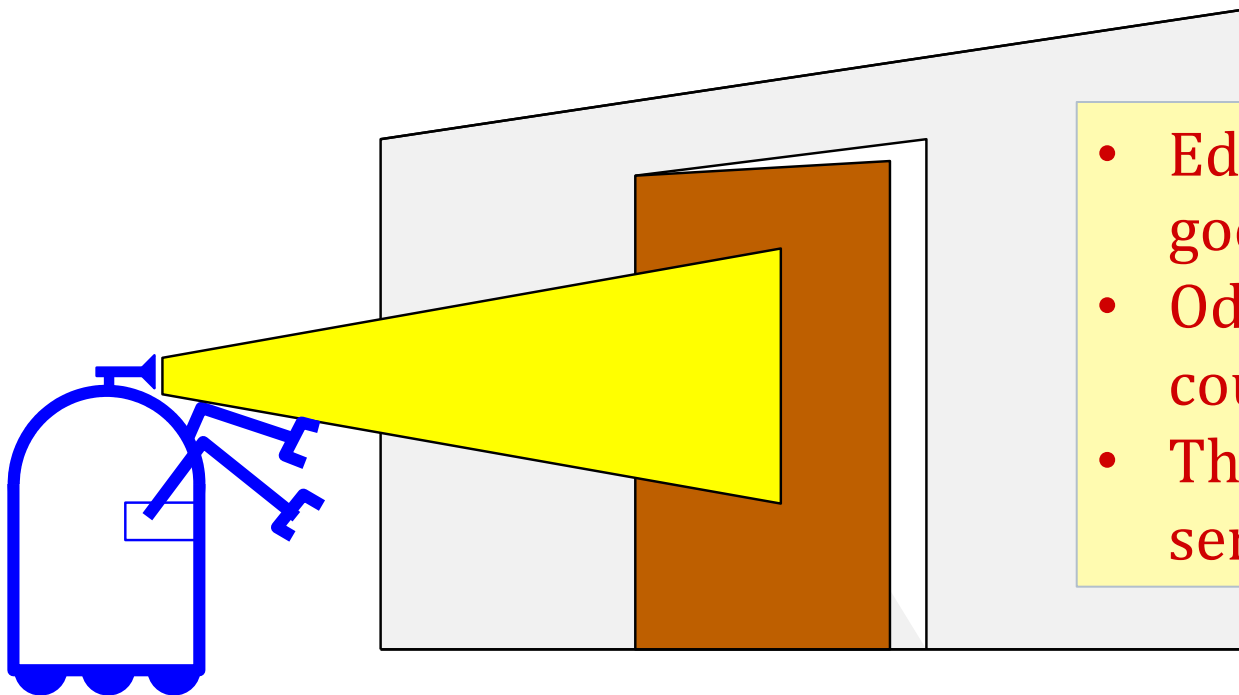
21

- ◆ What are the sources of uncertainties?
 - ◆ Blown-out camera; iffy rangefinder; skidding wheel; background noise; poor speech model; what else?
- ◆ How can uncertainties be represented / quantified
 - ◆ Deterministic vs. random error
- ◆ How do they propagate?
 - ◆ Uncertainty of a function of uncertain values?
 - ◆ How do uncertainties combine if different sensor readings are *fused*?

Example: State Estimation

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- ◆ Is the door open?
 - ◆ Camera + edge detection says the door is not at right angles
 - ◆ Odometry says I'm 2.0 meters away from door frame
 - ◆ Depth sensor says I'm 2.0 meters away from door

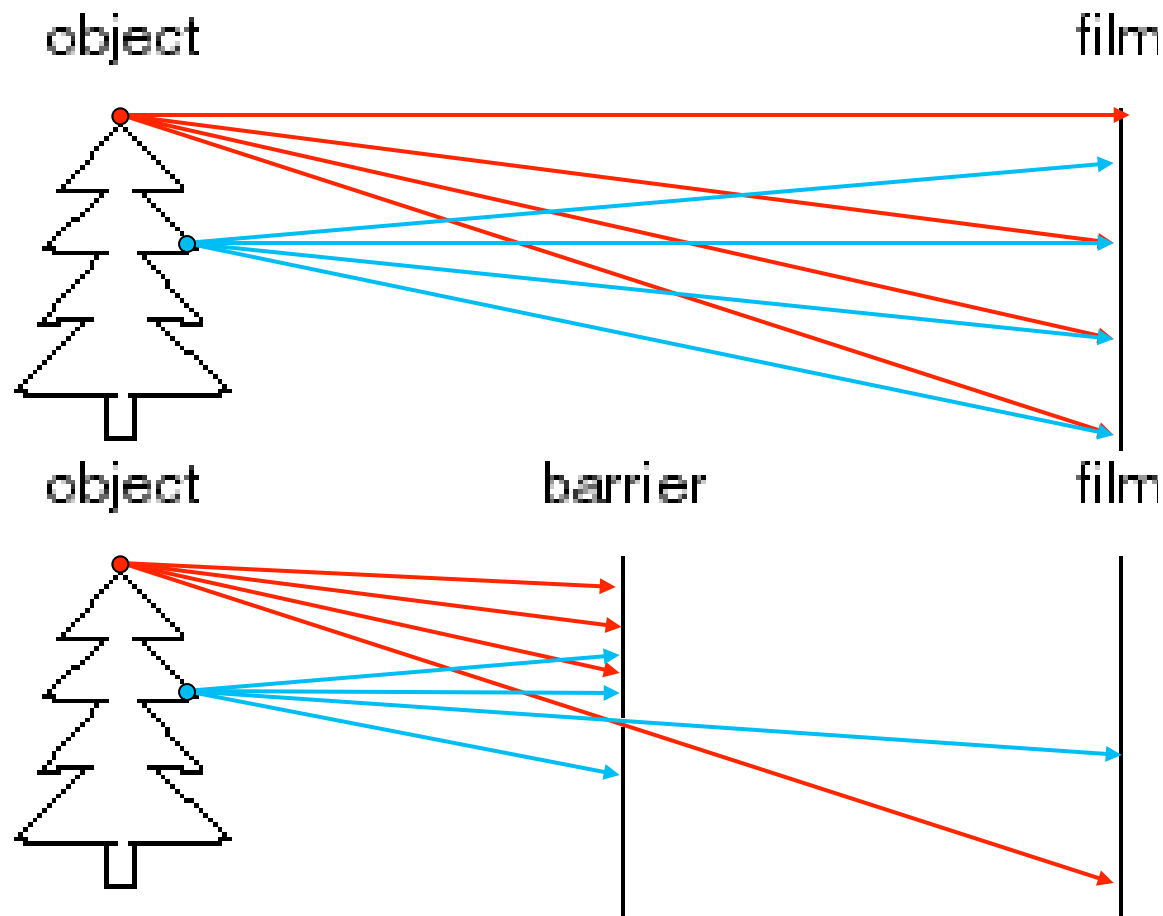


- Edge detection pretty good indoors?
- Odometry very noisy; could be off by 20cm.
- This specific depth sensor is very good

Sensors: Vision

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- ◆ How does a camera work?





Range (Distance) Sensors

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- ◆ Range sensors – how far is robot from something?
 - ◆ Key element for localization and environment modeling
 - ◆ Stereo
 - ◆ Humans; Bumblebee/Bb2
 - ◆ Time-of-Flight
 - ◆ Laser
 - ◆ Sonar
 - ◆ Kinect 2
 - ◆ Structured Light
 - ◆ Kinect
- } Active

Actuators

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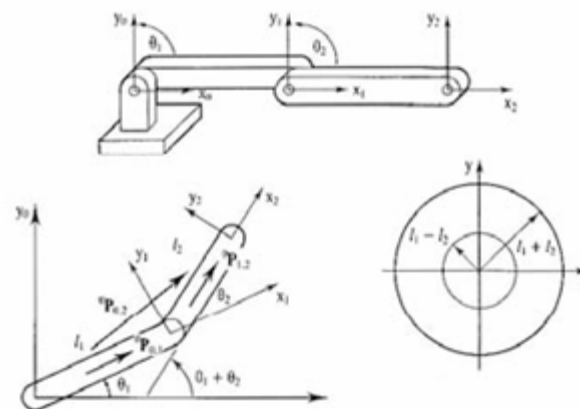
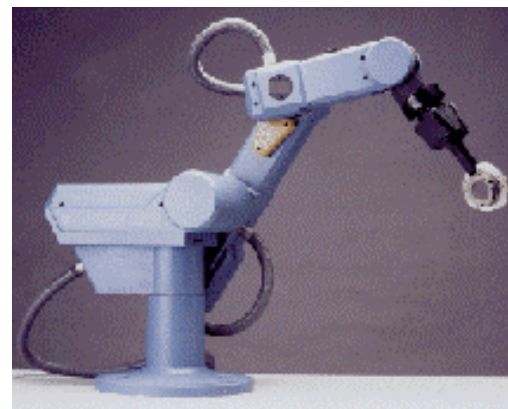
- ◆ Take some kind of action in the world
 - ◆ Involve movement of robot or subcomponent of robot
- ◆ Robot actions can include?
 - ◆ Pick and place: Move items between points
 - ◆ Path control: Move along a programmable path
 - ◆ Sensory: Employ sensors for feedback (e-field sensing)
 - ◆ Manipulation: interact with objects in the world



Some Typical Actuators

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- ◆ Pneumatic
- ◆ Hydraulic
- ◆ Electric solenoid
- ◆ Motors
 - ◆ Definitely know this one.



Manipulation

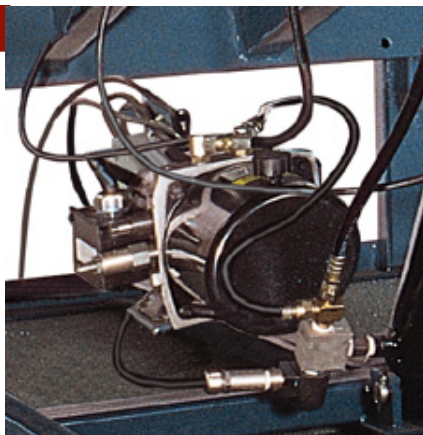
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- ◆ What is a manipulator?
 - ◆ Manipulates something in the world
 - ◆ Directly or indirectly
- ◆ What kinds exist?
 - ◆ Realistically it's:
 - ◆ Grippers
 - ◆ Other



Actuators

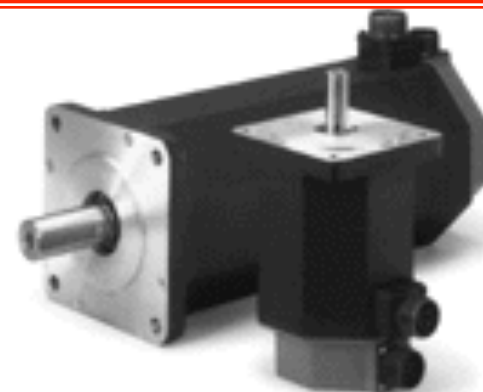
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Hydraulic Motor



Pneumatic Cylinder



Stepper Motor



Pneumatic Motor



DC Motor



Servo Motor

Motors

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- ◆ Should know now how these work!
- ◆ What is a motor?
 - ◆ Basic idea: electricity goes in, rotation happens.
 - ◆ Rotation is really useful!



Other Choices

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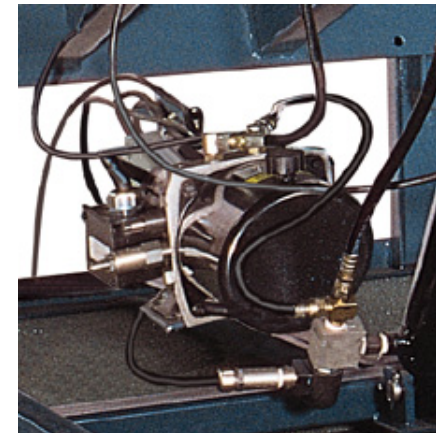
- ◆ Hydraulic/pneumatic
 - ◆ Heavy loads, high speeds
 - ◆ Sometimes hard to control (esp. pneumatic)
 - ◆ Doesn't produce sparks



Pneumatic Motor



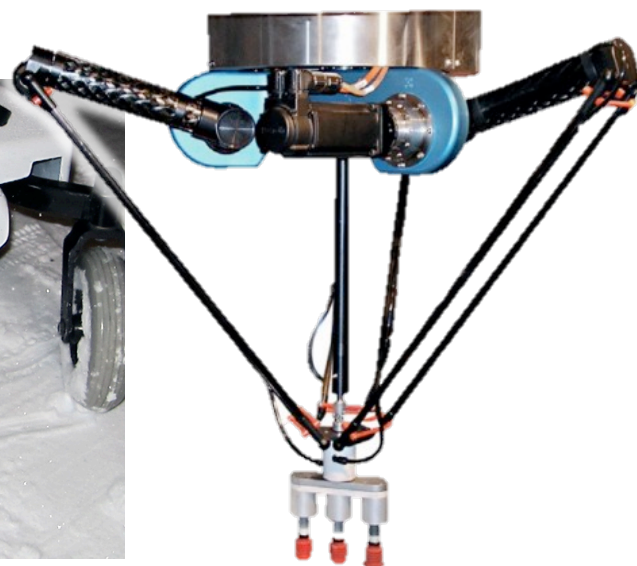
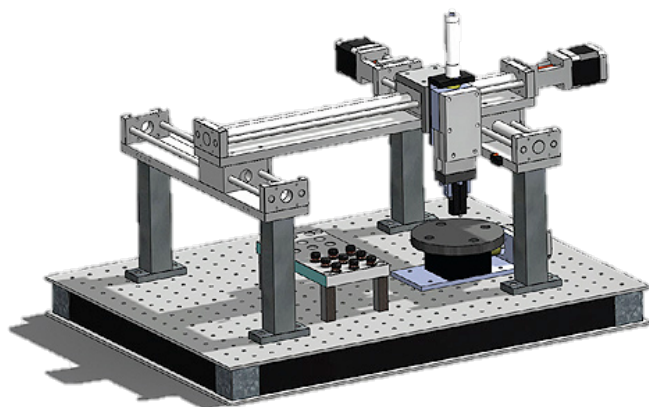
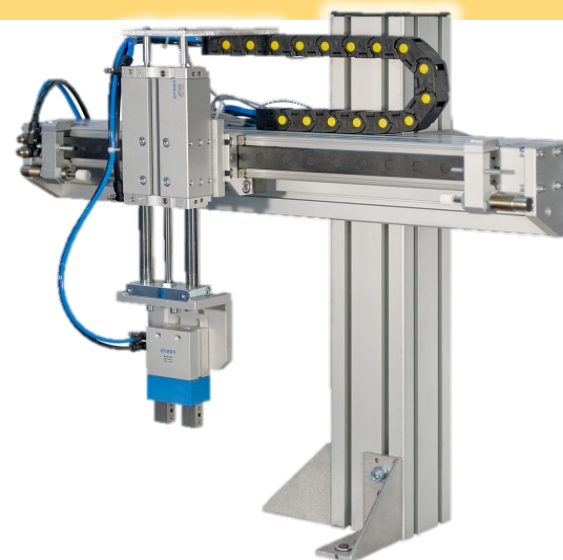
Pneumatic Cylinder



Hydraulic Motor

Manipulators

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Terminology

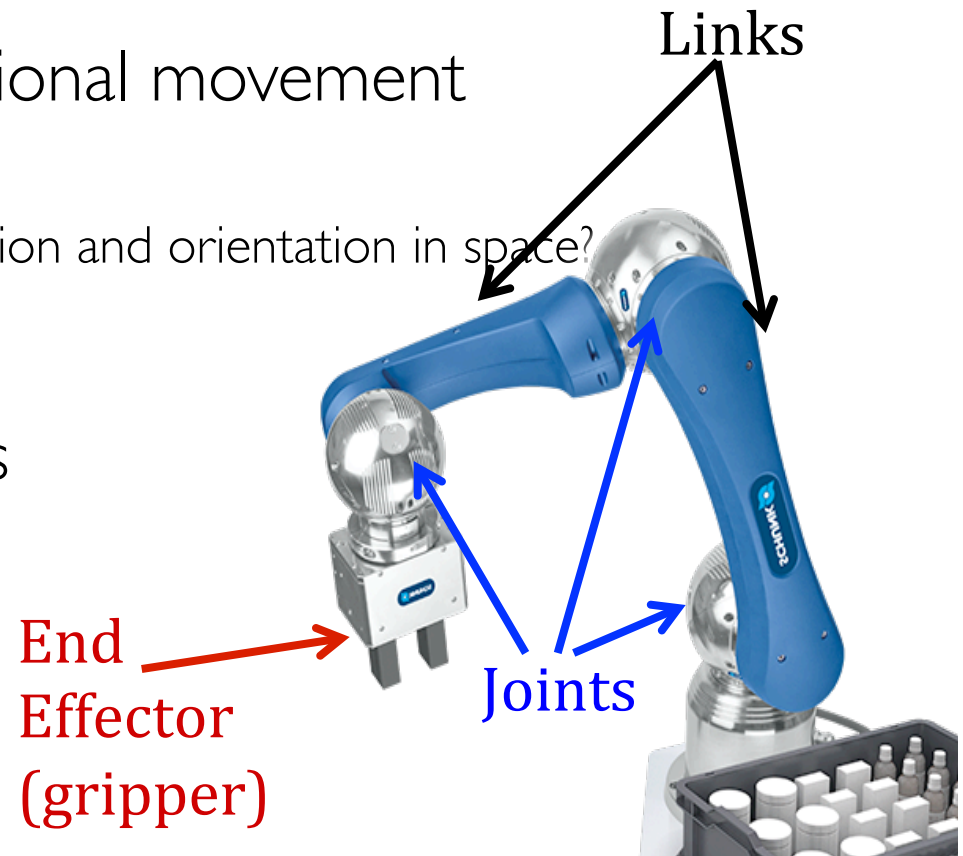
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- ◆ Actuator
 - ◆ Generates motion or force; usually a motor
 - ◆ “Drive type”
- ◆ Actuation
 - ◆ How are the individual parts made to move?
- ◆ End Effector
 - ◆ Device at the end of an arm; interacts with environment
- ◆ DoFs
- ◆ Gripper

Manipulator Robot

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- ◆ Modeled as a chain of *rigid links* connected by *joints*
- ◆ Links: unjointed length of robot
- ◆ Joints: translational or rotational movement
 - ◆ Joints have DoFs
 - ◆ How many to describe its position and orientation in space?
 - ◆ Sliding or jointed
- ◆ Manipulator / End Effectors
 - ◆ Grippers / Tools
 - ◆ Sensors



Characterization

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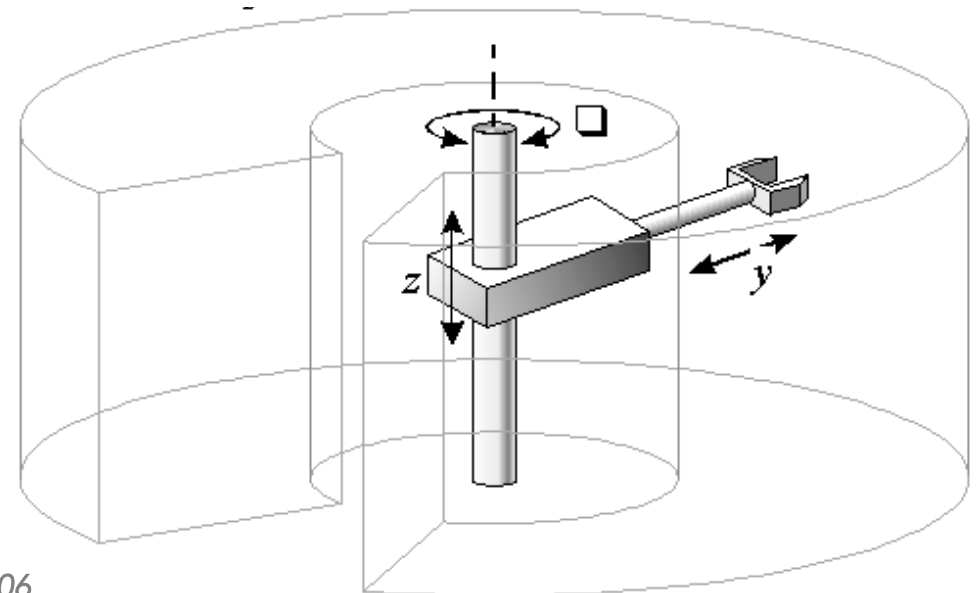
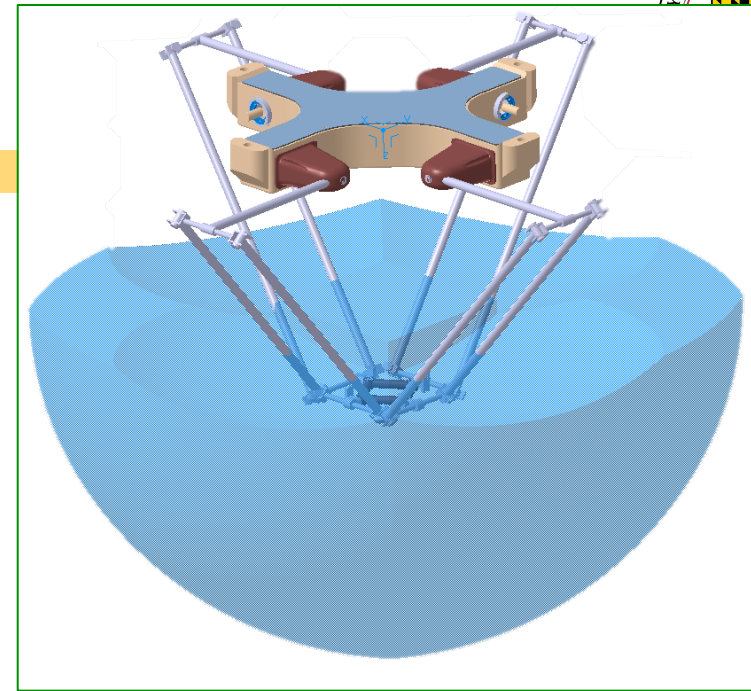
- ◆ By drive
- ◆ By actuation
 - ◆ Tendons
 - ◆ Direct servoing
 - ◆ Underactuation
- ◆ By motion
 - ◆ Prismatic (linear)
 - ◆ Revolute (rotational)
- ◆ By Characteristics
 - ◆ Payload
 - ◆ Working area/radius



Workspaces

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- ◆ Configuration provides *geometry*
- ◆ **Workspace**
 - ◆ Set of all possible *positions* of end effector
- ◆ **Dexterous workspace**
 - ◆ Set of points where end effector can be any orientation



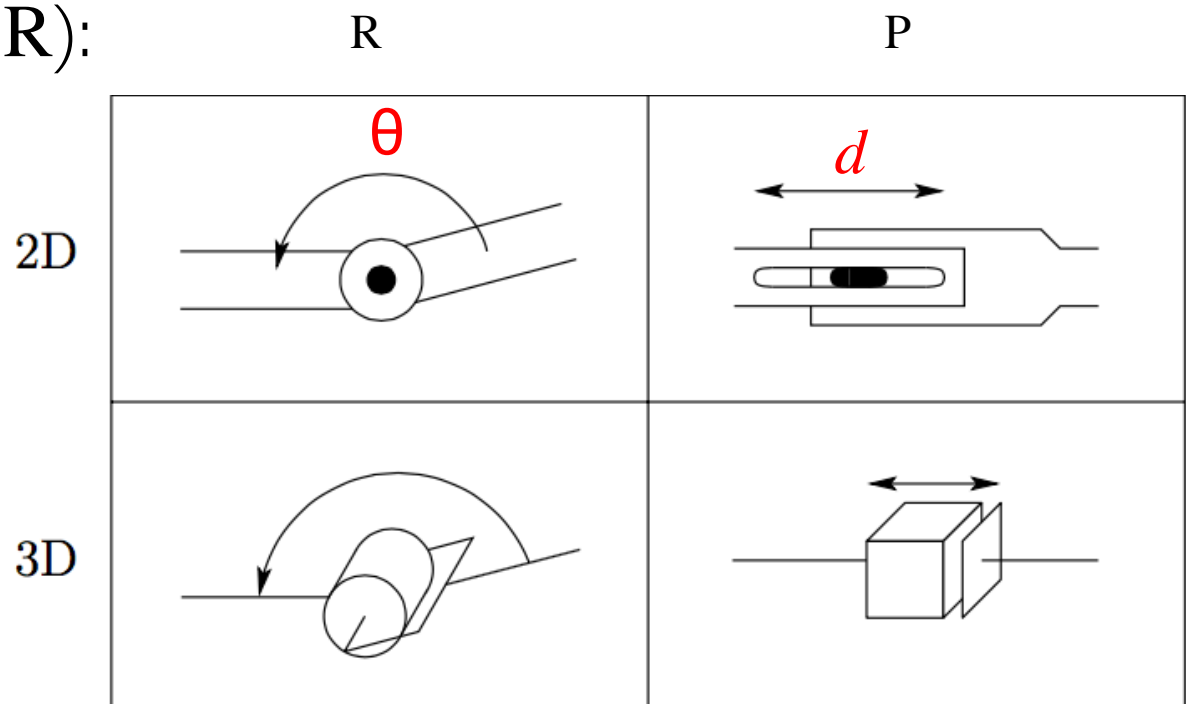
Joints, P(rismatic) & R(evolute)

36

- ◆ *Prismatic* (denoted **P**): sliding / translational / linear; allows a linear relative motion between 2 links

- ◆ *Revolute* (denoted **R**): Rotational; allows relative rotation between two links

- ◆ Combinations of these describe arm *configuration*



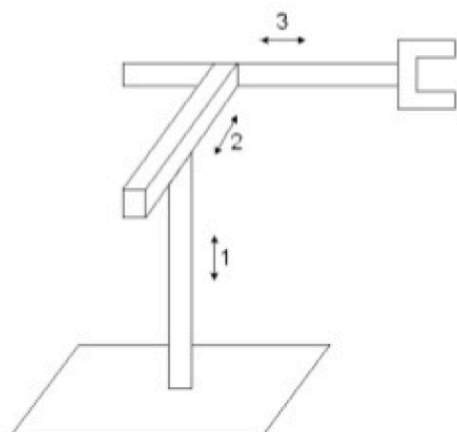
- ◆ All possible configurations = *configuration space*

Spong, Hutchinson, Vidyasagar. Robot Modeling and Control. 2006.

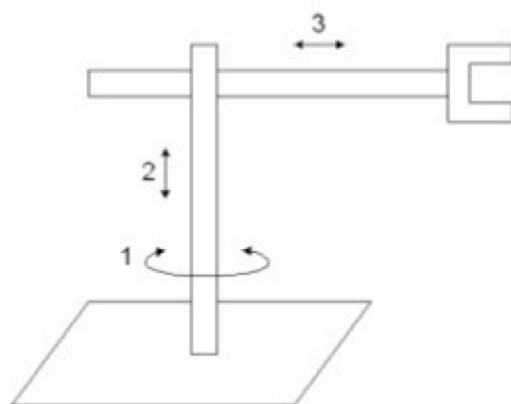
Configurations

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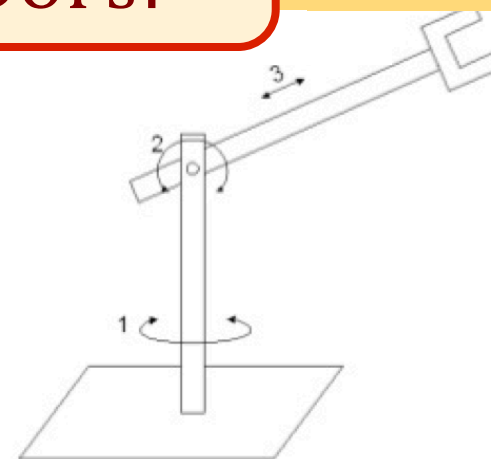
How many
DOFs?



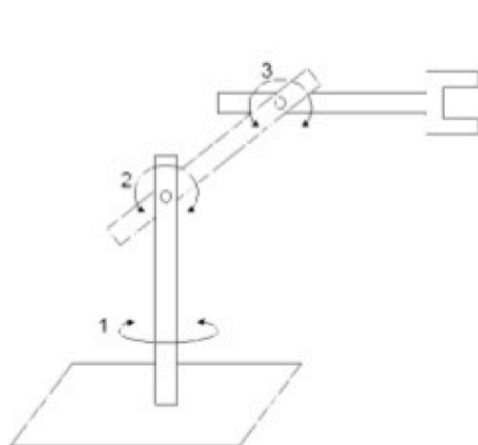
Cartesian: PPP



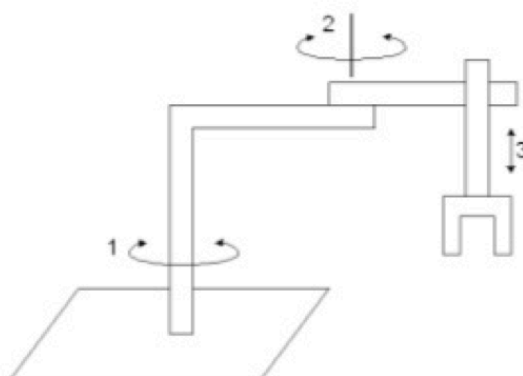
Cylindrical: RPP



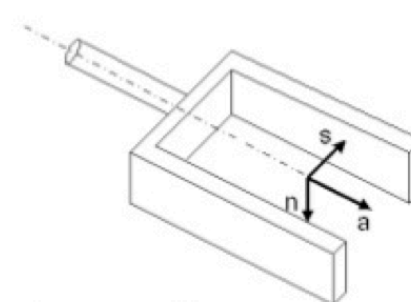
Spherical: RRP



Articulated: RRR



SCARA: RRP



Hand coordinate:

n: normal vector; **s**: sliding vector;

a: approach vector

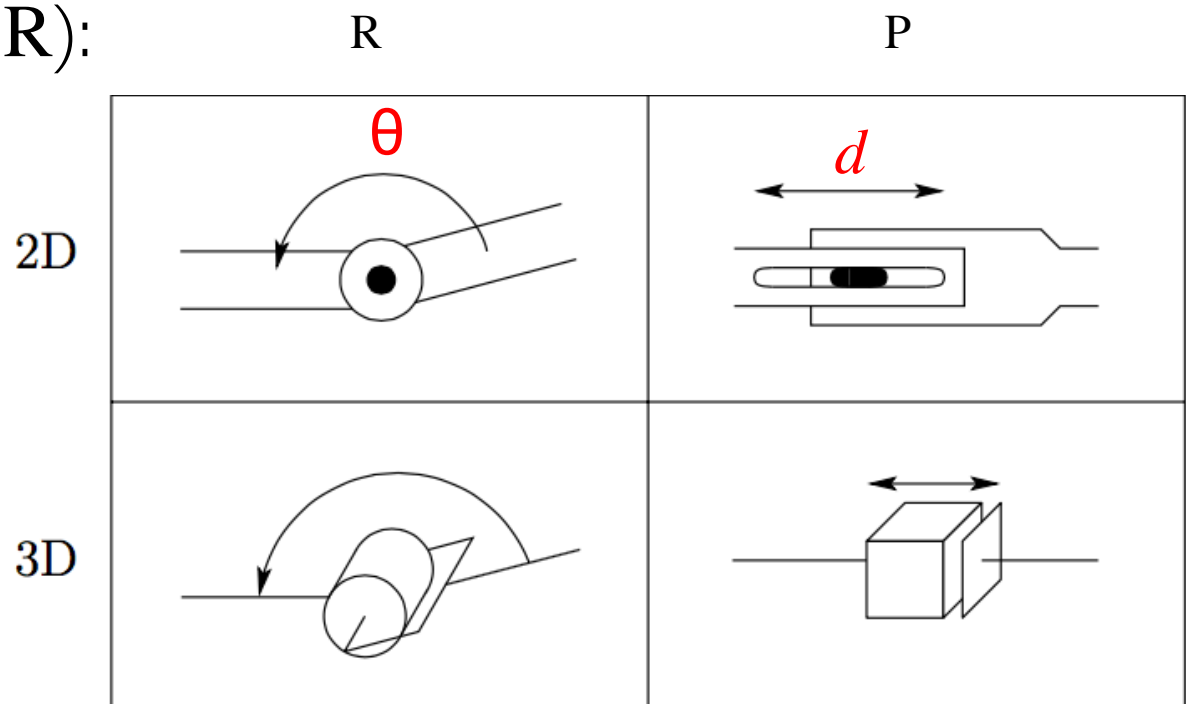
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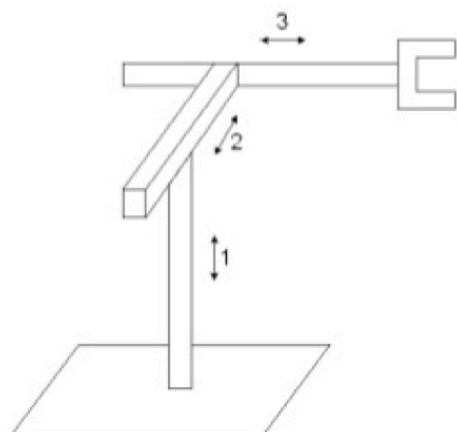
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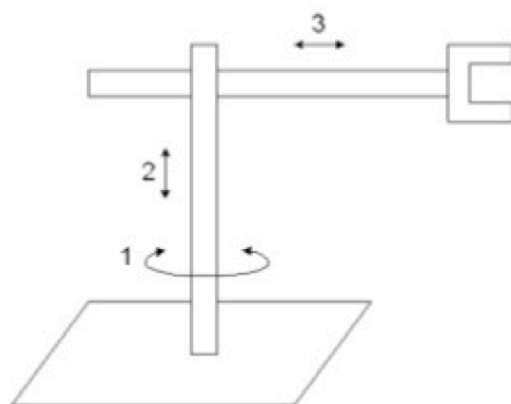
Configurations

39

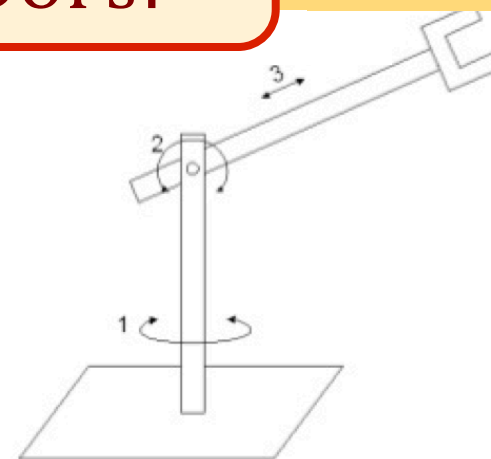
How many
DOFs?



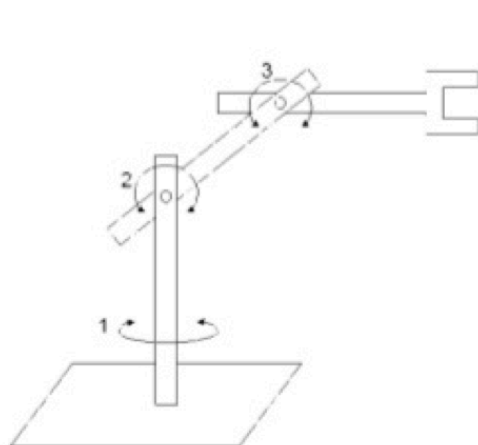
Cartesian: PPP



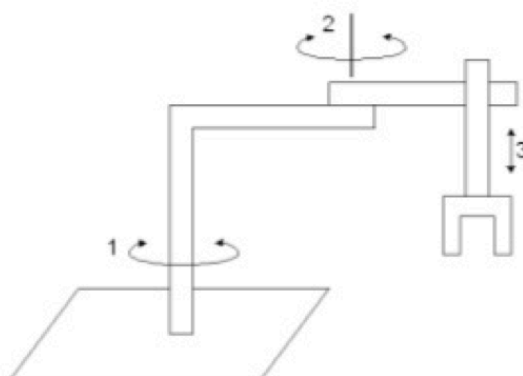
Cylindrical: RPP



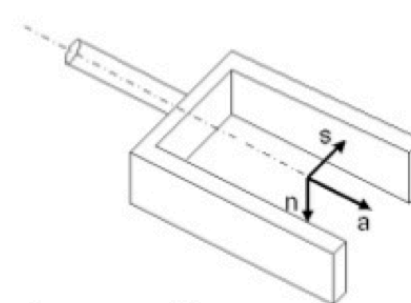
Spherical: RRP



Articulated: RRR



SCARA: RRP



Hand coordinate:

n: normal vector; **s**: sliding vector;

a: approach vector



Kinematics

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- ◆ What is kinematics?
 1. The study of the **motion of objects**.
 2. The study of the geometrically possible motion of a body or system of bodies without consideration of the causes and effects of the motions
- ◆ Movement determines the (eventual) position and orientation of the robot
 - ◆ Mobile: position and orientation wrt. an **arbitrary** initial frame
 - ◆ Manipulator: position and orientation of end effector*
- ◆ Where are we? How did we get there?

Kinematics: Position and Orientation

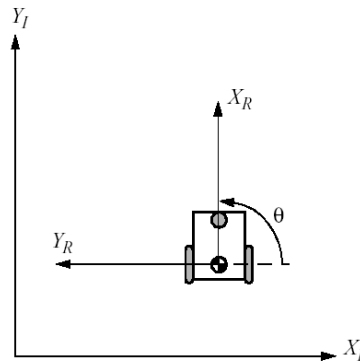
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Where is it?

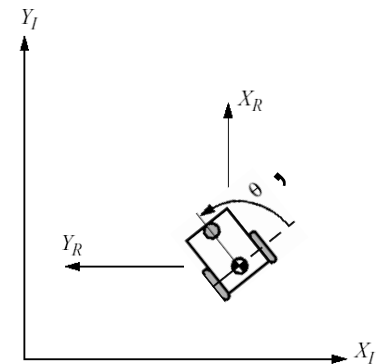
What's its orientation?

Mobile

On an $\{x,y\}$ plane



Heading θ

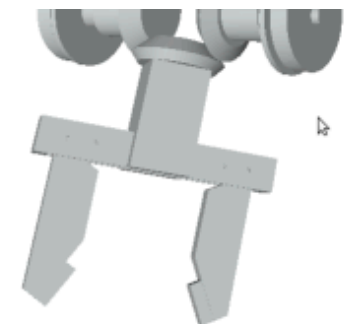


Manipulator

In some $\{x,y,z\}$ space



$\{r/p/y\}$ of end effector



Mobile Kinematics

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- ◆ Kinematics:
 - ◆ Geometrically possible motion of a body or system of bodies without consideration of the causes and effects of the motions
- ◆ For mobile robots: position and orientation
 - ◆ Kinematics:
 - ◆ I moved this way. Where am I and where am I pointed?
 - ◆ Inverse Kinematics (IK):
 - ◆ I'm here, pointed this way. What motions got me there?
 - ◆ I want to be here pointed this way. What motions should I make?
- ◆ Position and orientation wrt. an arbitrary initial frame



Mobile Position & Orientation

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Frames of reference:

$\{X_I, Y_I\}$: Global

$\{X_R, Y_R\}$: Robot

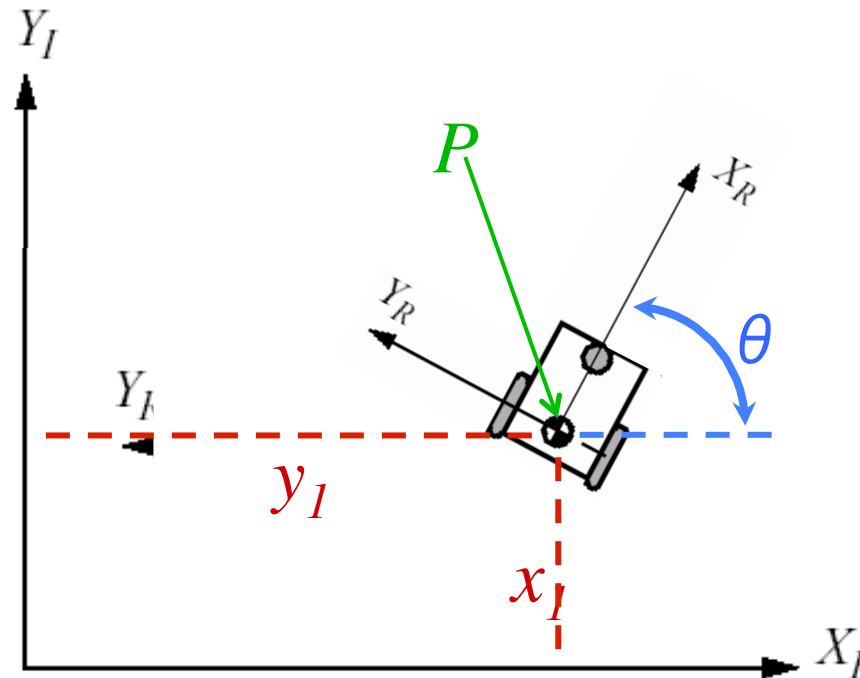
Robot: point P

Position (of P):

$\{x_{I,1}, y_{I,1}\}$

Heading:

$\{\theta\}$: $I \angle R$



$$\xi_I = \begin{bmatrix} x \\ y \\ \theta \end{bmatrix}$$

Mapping Between Frames

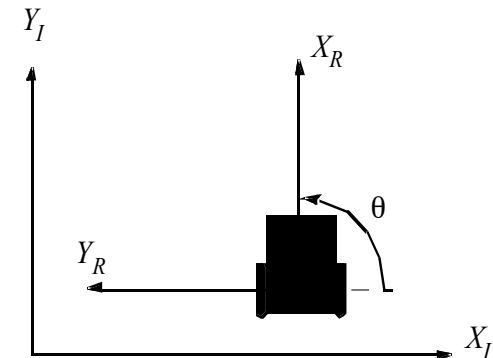
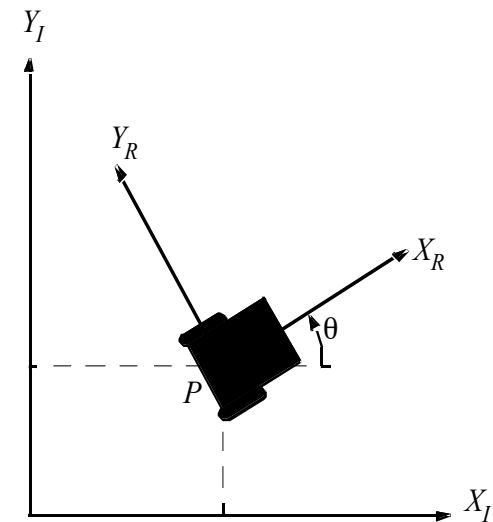
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- ◆ Global reference frame \leftrightarrow
local reference frame

$$\{X_I, Y_I\} \leftrightarrow \{X_R, Y_R\}$$

- ◆ Map motion from **axes** of one to **axes** of the other
 - ◆ This mapping depends on current pose
- ◆ Use *orthogonal reference frame*:

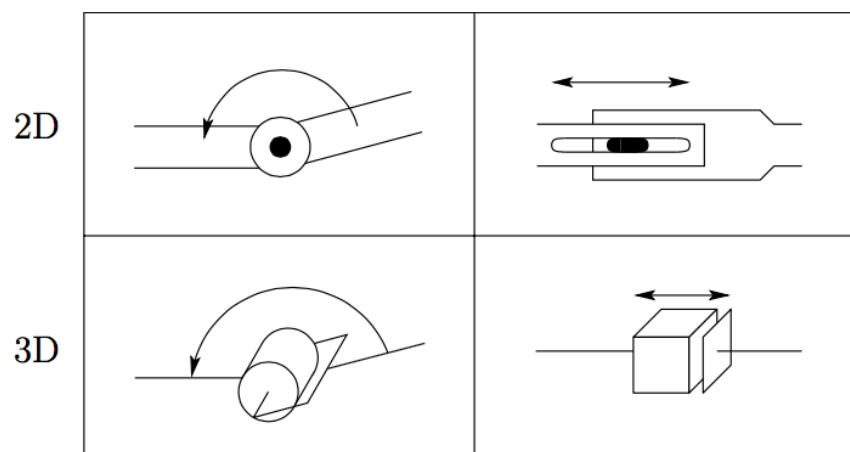
$$R(\theta) = \begin{bmatrix} \cos \theta & \sin \theta & 0 \\ -\sin \theta & \cos \theta & 0 \\ 0 & 0 & 1 \end{bmatrix}$$



Manipulator Kinematics

45

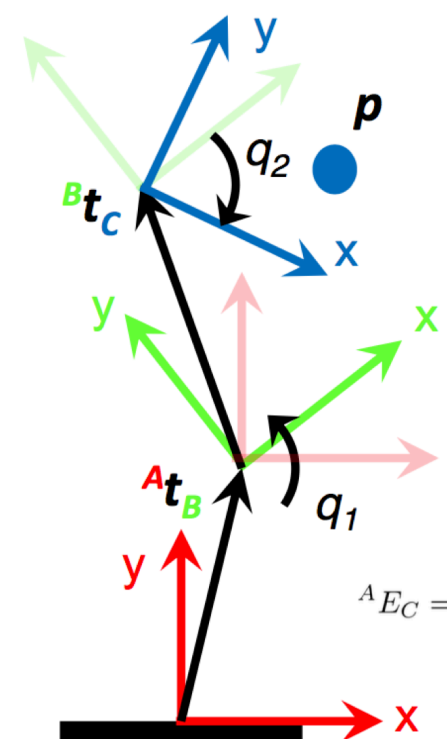
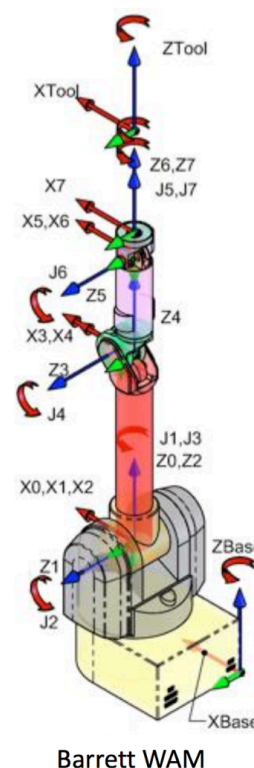
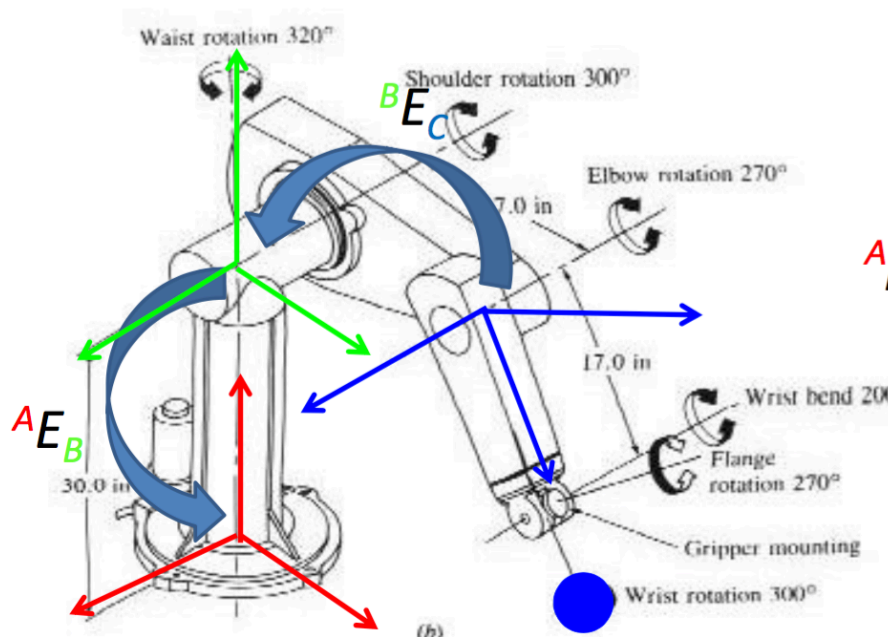
- ◆ Kinematics:
 - ◆ Geometrically possible motion of a body or system of bodies
- ◆ For manipulator robots
 - ◆ **End effector** position and orientation, wrt. an arbitrary initial frame
- ◆ A manipulator is moved by changing its...
 - ◆ Joints: revolute and prismatic



Multiframe Kinematics

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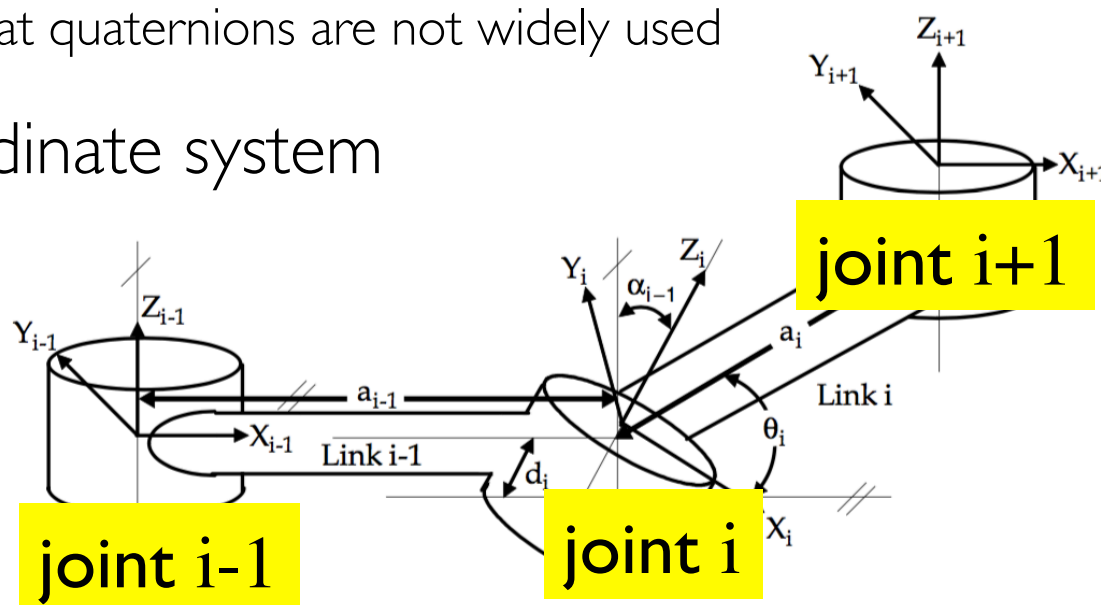
- ◆ How many frames of reference do we have?
 - ◆ We've been translating among frames based on possible motion
- ◆ How do they relate?



Describing A Manipulator

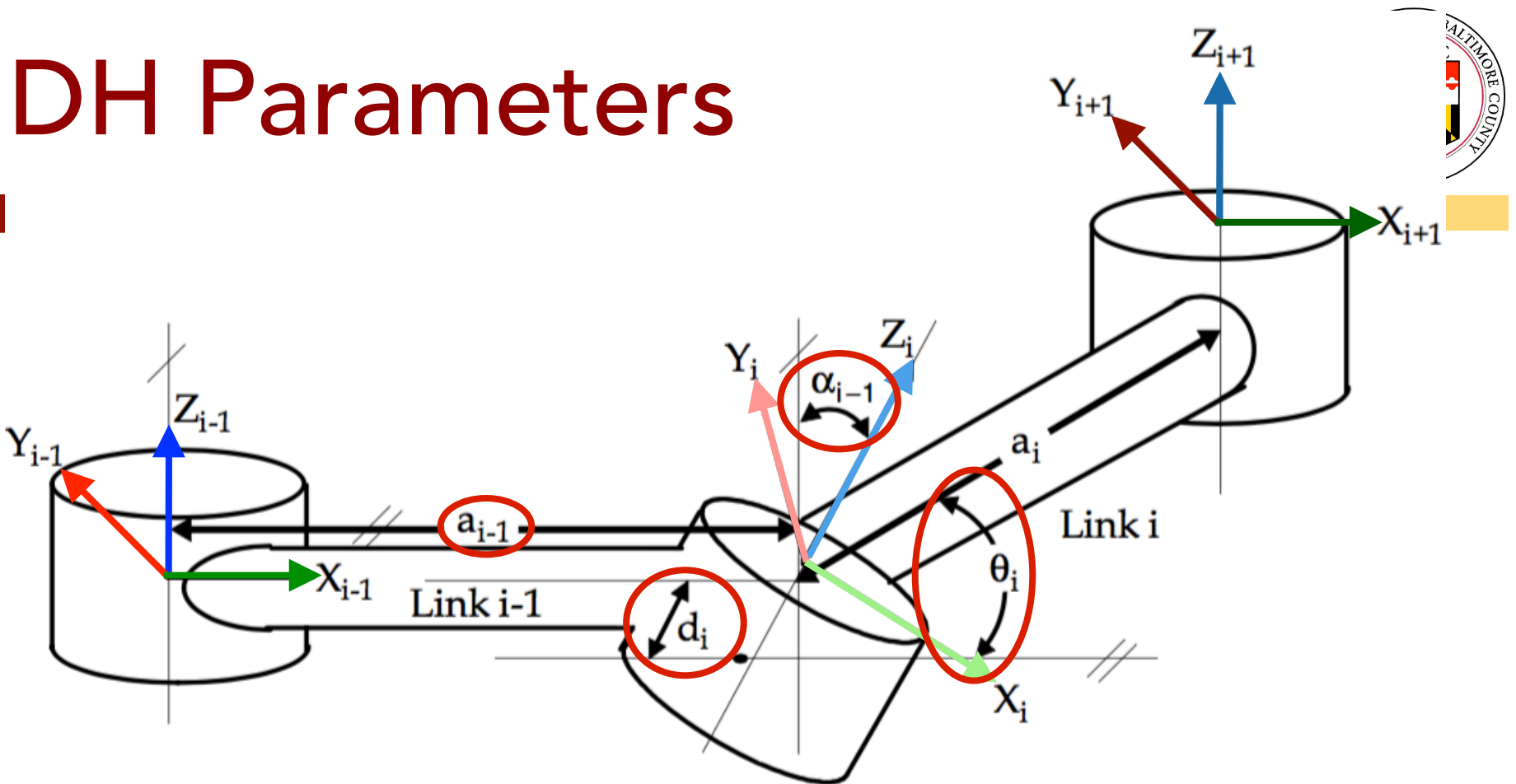
47

- ◆ Arm made up of links in a chain
 - ◆ How to describe each link?
 - ◆ Many choices exist
 - ◆ DH parameters widely used
 - ◆ Although it's not true that quaternions are not widely used
- ◆ Joints **each** have coordinate system
 - ◆ $\{x,y,z\}$, r/p/y — **OR!!**
- ◆ *DH parameters*
 - ◆ Denavit-Hartenberg
 - ◆ $a_{i-1}, \alpha_{i-1}, d_i, \theta_i$



DH Parameters

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a_{i-1} : link length – distance Z_{i-1} and Z_i along X_i

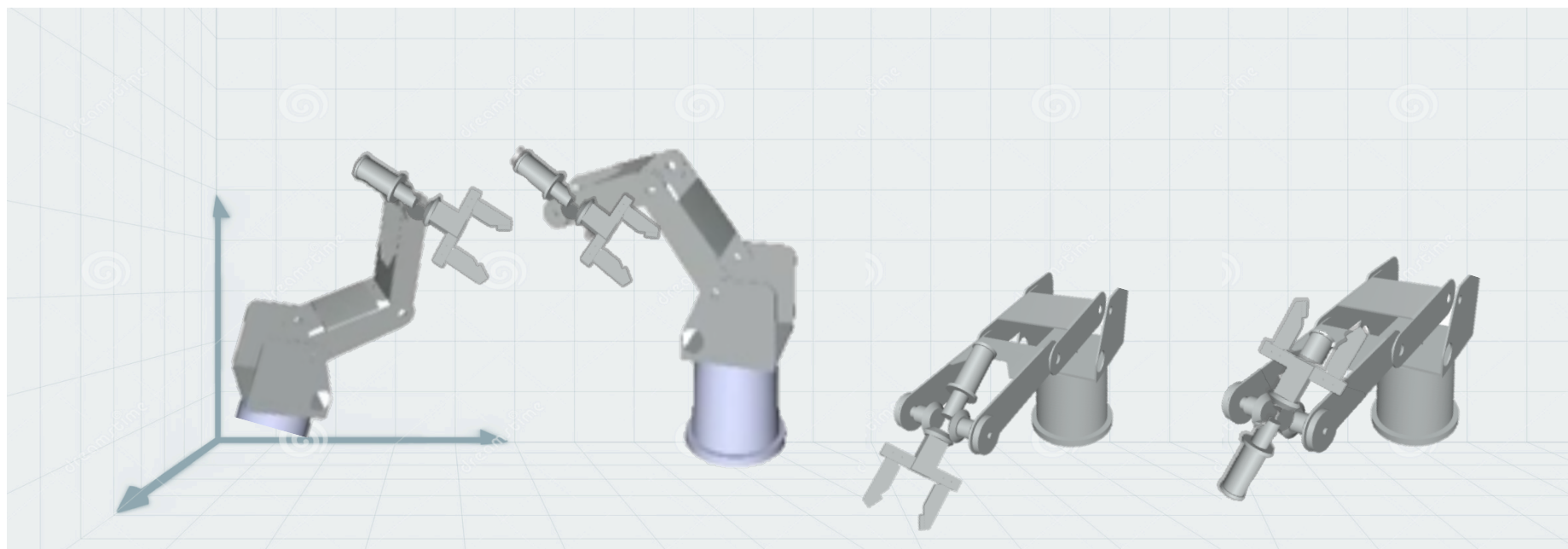
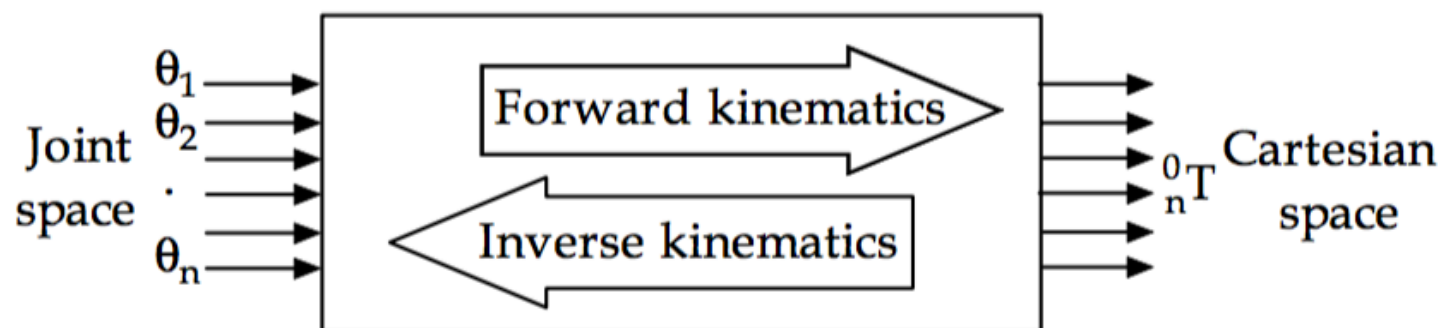
α_{i-1} : link twist – angle Z_{i-1} and Z_i around X_i

d_i : link offset – distance X_{i-1} to X_i along Z_i

θ_i : joint angle – angle X_{i-1} and X_i around Z_i

Forward Kinematics & IK

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Analytical vs. Numerical

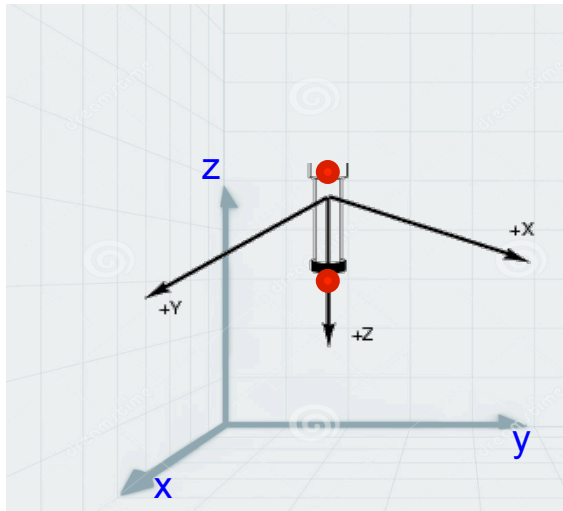
50

- ◆ One major way to classify IK-solving approaches: **analytical** vs **numerical** methods
- ◆ Analytical
 - ◆ Find an exact solution by directly inverting the forward kinematics equations.
 - ◆ Works on relatively simple chains.
- ◆ Numerical
 - ◆ Use approximation and iteration to converge on a solution.
 - ◆ More expensive, more general purpose.
- ◆ We will look at one technique: Jacobians

Actual Goal

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- ◆ Transform between robot and world coordinates
 - ◆ Why?
- ◆ Transformation of parts (points) of the robot



R: {0, 0, 0}

I: {4, 2, 3}

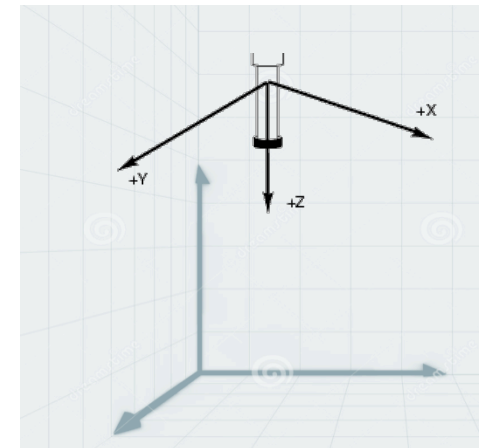
R: {0, 0, -2}

I: {4, 2, 5}

Actual Goal

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- ◆ Affine transformation
 - ◆ Preserves collinearity (i.e., all points lying on a line initially still lie on a line after transformation)
 - ◆ Preserves ratios of distances (e.g., the midpoint of a line segment remains the midpoint after transformation)
- ◆ Rigid transform
 - ◆ Reflections, translations, rotations
 - ◆ Preserves internal relationship of points
 - ◆ Distances between every pair of points
 - ◆ (Remember, this is not the robot moving!)



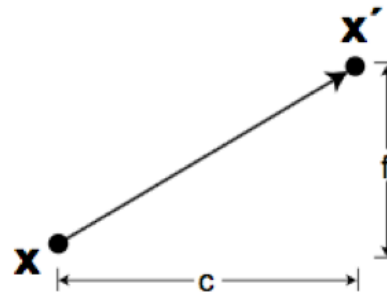
Affine Transformations

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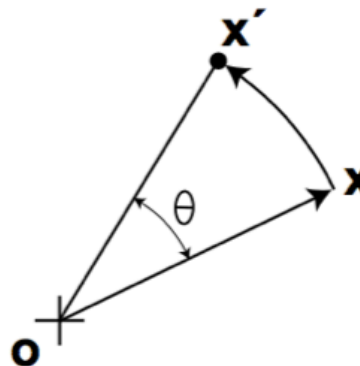
- ◆ Affine transformations:
- ◆ Given a point x (x,y), transformed x' can be written:

$$x' = \begin{bmatrix} ax + by + c \\ dx + ey + f \end{bmatrix}$$

- ◆ Translation
- ◆ Rotation
- ◆ Scaling
- ◆ Shear



$$x' = \begin{bmatrix} x+c \\ y+f \end{bmatrix}$$

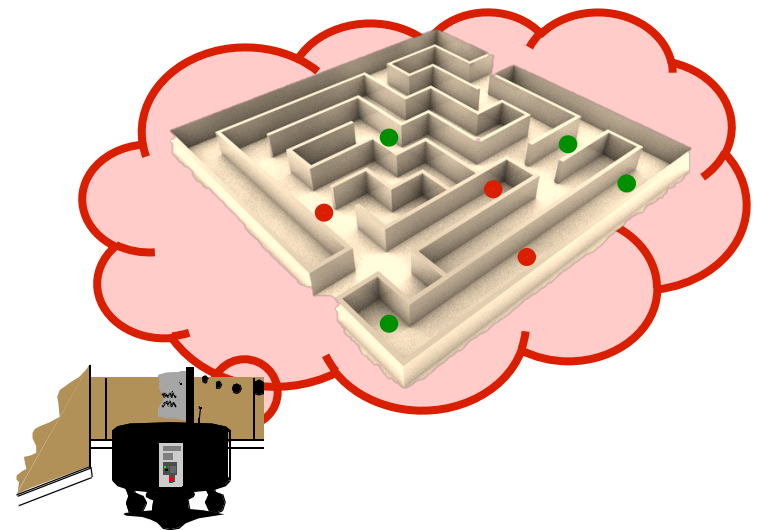


$$x' = \begin{bmatrix} x\cos\theta - y\sin\theta \\ x\sin\theta + y\cos\theta \end{bmatrix}$$

Localization: Where am I?

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- ◆ Given:
 - ◆ A map (which MAY be being found on the fly)
 - ◆ A set of sensor readings
- ◆ Where am I in that map?
- ◆ Things to consider:
 - ◆ Belief representation
 - ◆ Map representation
 - ◆ Types of sensor data
 - ◆ Probabilistic representations





Challenges of Localization

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- ◆ Knowing absolute position (e.g. GPS) is not sufficient
- ◆ Localization in human-scale as relates to environment
- ◆ Planning in *Cognition* needs >1 position as input
- ◆ Perception and motion plays an important role
 - ◆ Sensor noise
 - ◆ Sensor aliasing
 - ◆ Effector noise
 - ◆ Odometric position estimation
 - ◆ Probabilities and uncertainty management