



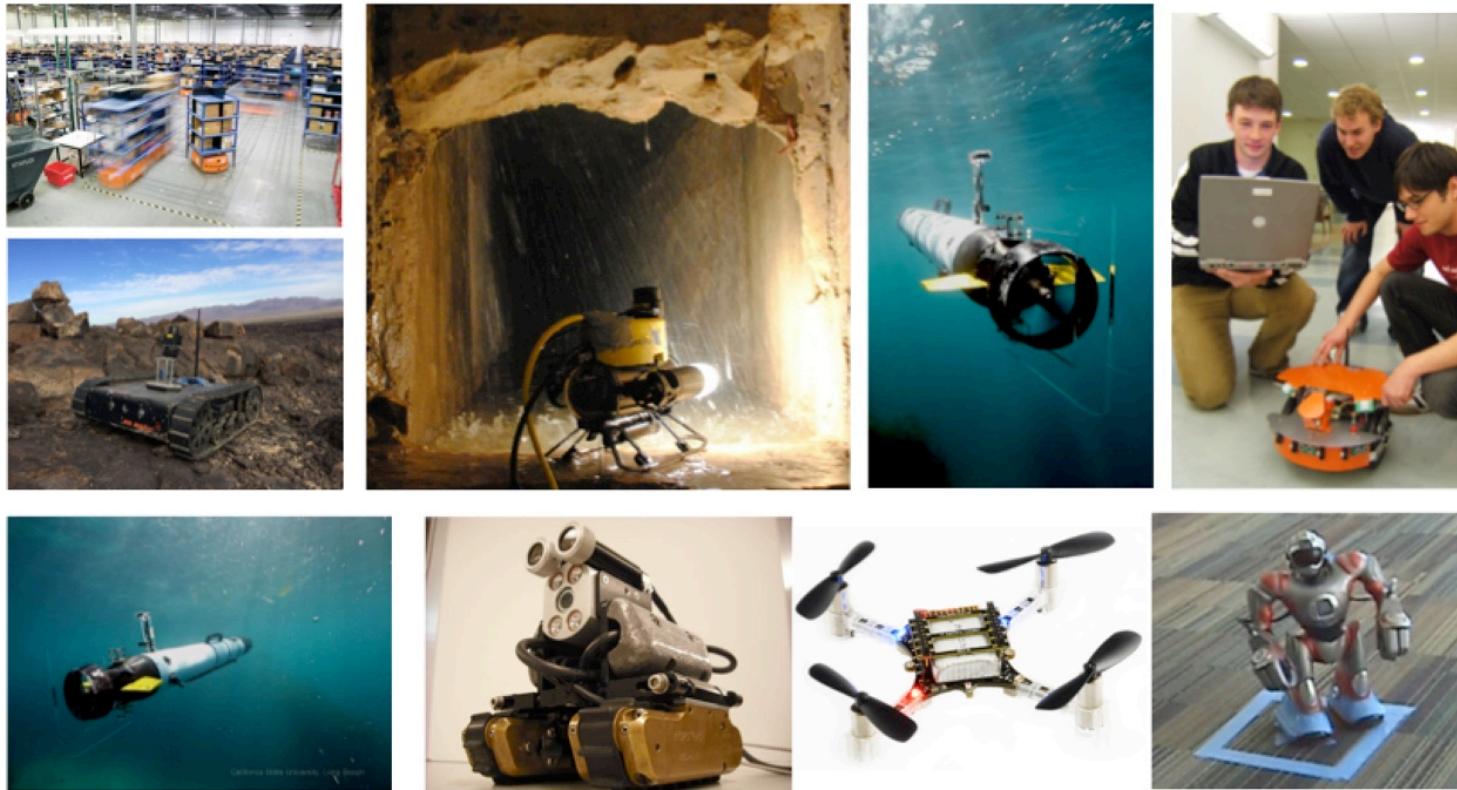
# ARW – Lecture 01

## Odometry Kinematics

Instructor: Chris Clark  
Semester: Summer 2016

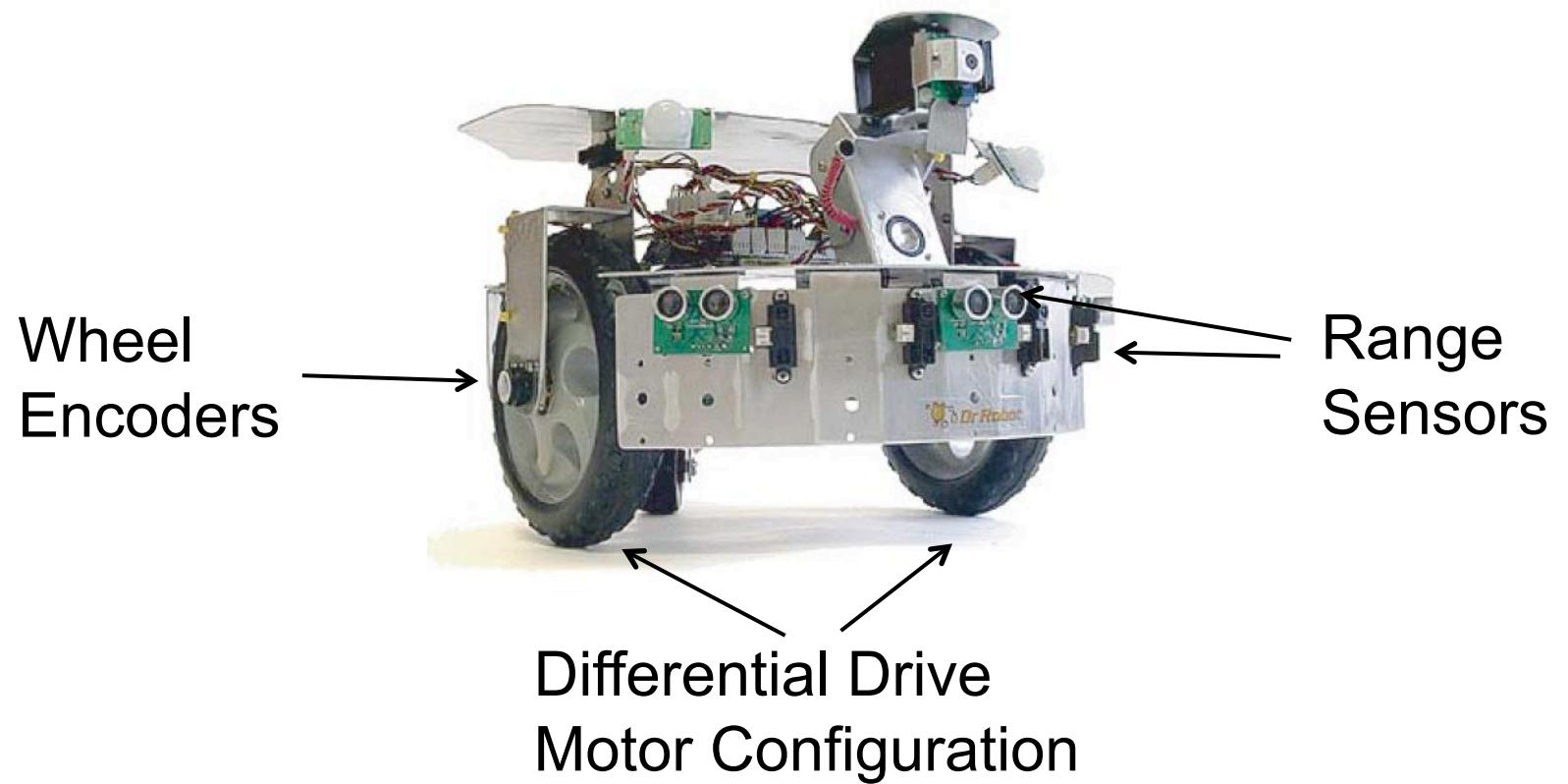


# Introduction





# Different Bots



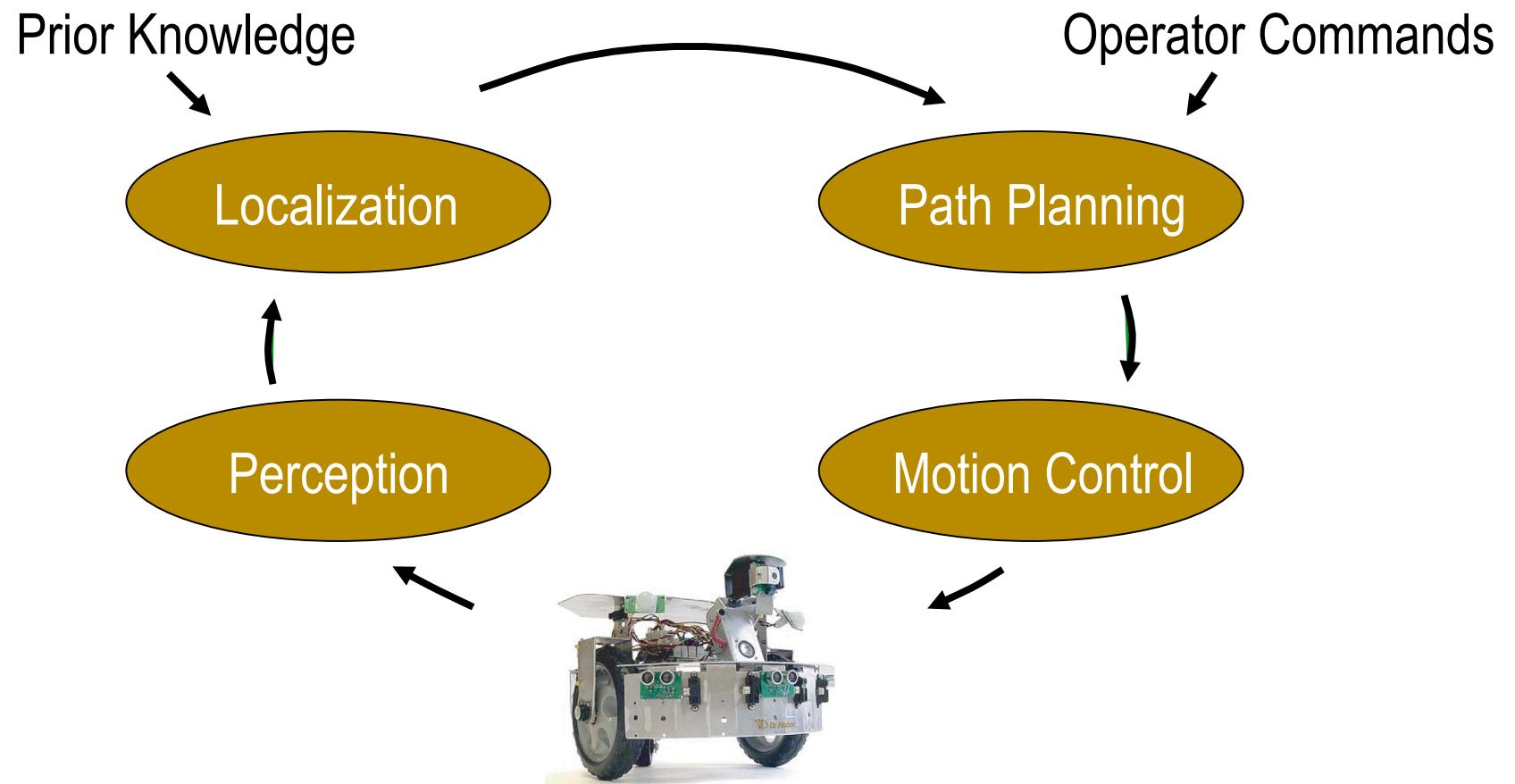


# Different Bots



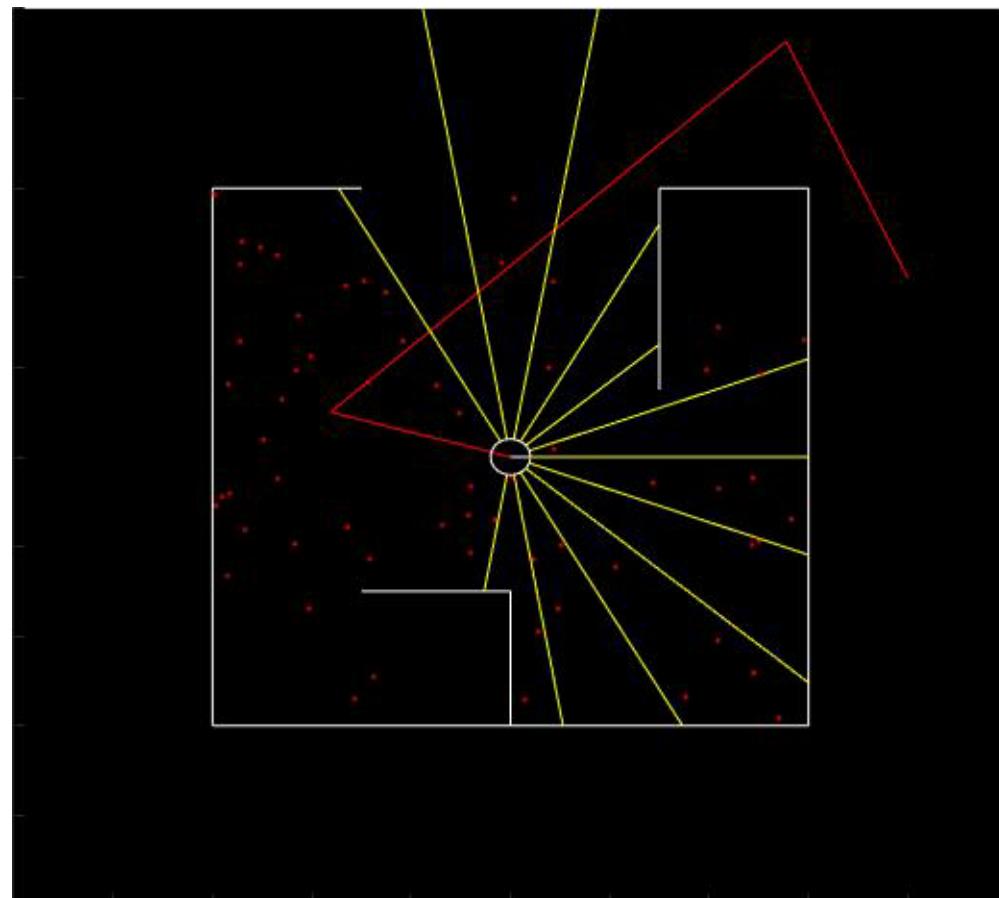


# Planning Based Control





# ARW Goals





# Odometry Kinematics

- Lecture Goal
  - Develop an equation that maps the previous robot state and wheel encoder measurements to the new robot state.

$$X_t = f(X_{t-1}, U_{t-1})$$



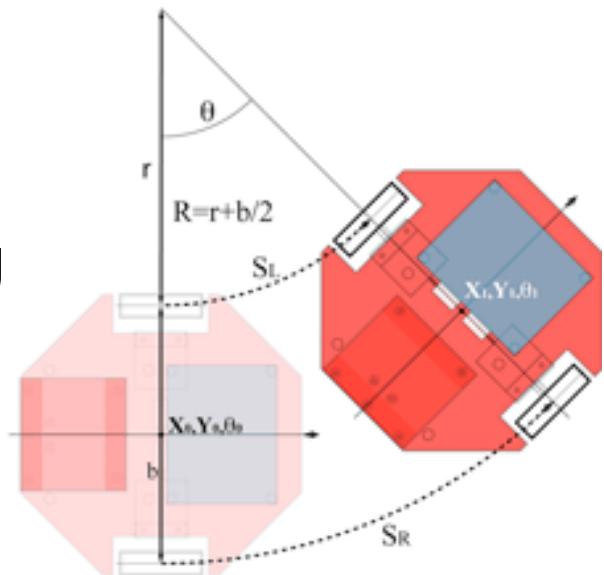
# Odometry Kinematics

1. Odometry & Dead Reckoning
2. Modeling motion – The X80
3. Modeling motion – An ROV
4. Odometry in your Sim



# Odometry & Dead Reckoning

- Odometry
  - Use wheel sensors to update position
- Dead Reckoning
  - Use wheel sensors and heading sensor to update position
- Straight forward to implement
- Errors are integrated, unbounded



<http://www.guioff.com>



# Odometry & Dead Reckoning

- Odometry Error Sources?



# Odometry & Dead Reckoning

- Odometry Error Sources?
  - Limited **resolution** during integration
  - Unequal **wheel diameter**
  - Variation in the **contact** point of the wheel
  - Unequal **floor** contact and variable friction can lead to slipping



# Odometry & Dead Reckoning

- Odometry Error Sources?





# Odometry & Dead Reckoning

- Odometry Errors
  - **Deterministic** errors can be eliminated through proper calibration
  - **Non-deterministic** errors have to be described by error models and will always lead to uncertain position estimate.



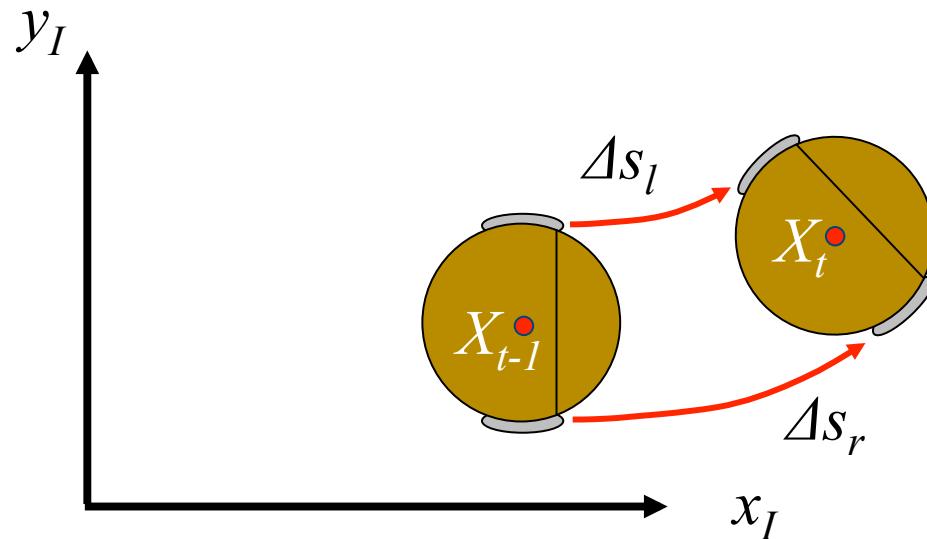
# Odometry Kinematics

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# Modeling Motion

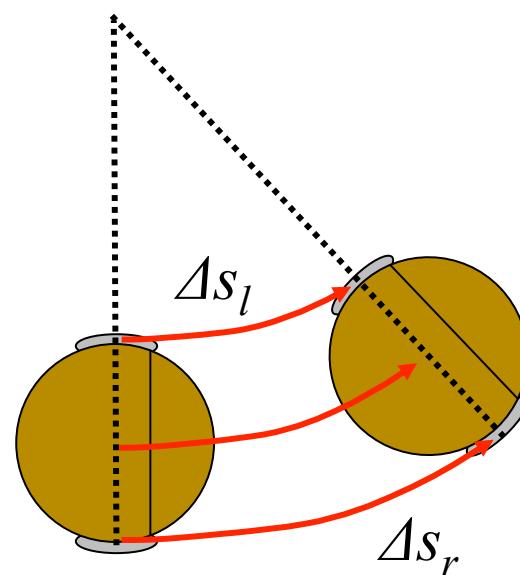
- If a robot starts from a position  $X_{t-1}$ , and the right and left wheels move respective distances  $\Delta s_r$  and  $\Delta s_l$ , what is the resulting new position  $X_t$  ?





# Modeling Motion

- To start, let's model the change in angle  $\Delta\theta$  and distance travelled  $\Delta s$  by the robot.
  - Assume the robot is travelling on a circular arc of constant radius.





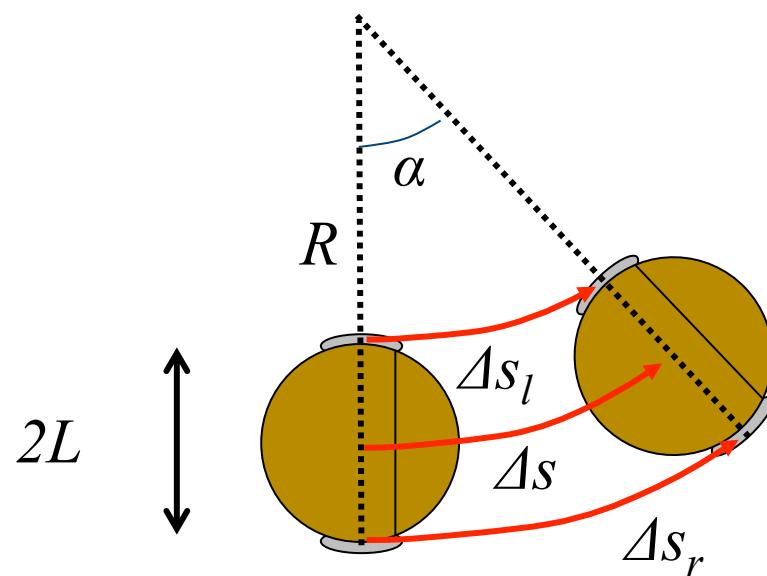
# Modeling Motion

- Begin by noting the following holds for circular arcs:

$$\Delta s_l = R\alpha$$

$$\Delta s_r = (R+2L)\alpha$$

$$\Delta s = (R+L)\alpha$$





# Modeling Motion

- Now manipulate first two equations:

$$\Delta s_l = R\alpha \quad \Delta s_r = (R+2L)\alpha$$

To:

$$\begin{aligned} R\alpha &= \Delta s_l \\ L\alpha &= (\Delta s_r - R\alpha)/2 \\ &= \Delta s_r/2 - \Delta s_l/2 \end{aligned}$$



# Modeling Motion

- Substitute this into last equation for  $\Delta s$ :

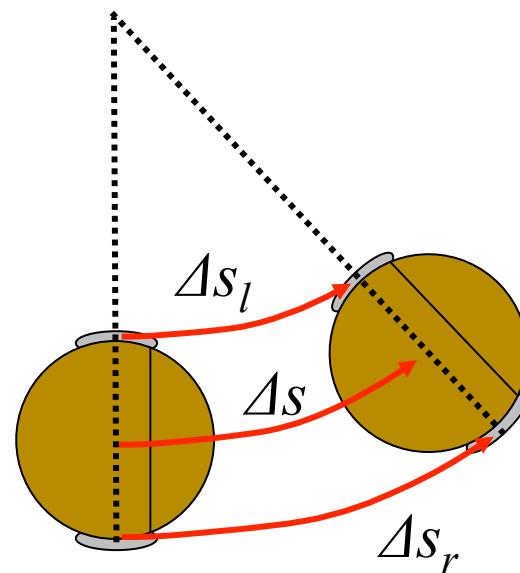
$$\begin{aligned}\Delta s &= (R+L)\alpha \\&= R\alpha + L\alpha \\&= \Delta s_l + \Delta s_r/2 - \Delta s_l/2 \\&= \Delta s_l/2 + \Delta s_r/2 \\&= \frac{\Delta s_l + \Delta s_r}{2}\end{aligned}$$



# Modeling Motion

- Or, note the distance the center travelled is simply the average distance of each wheel:

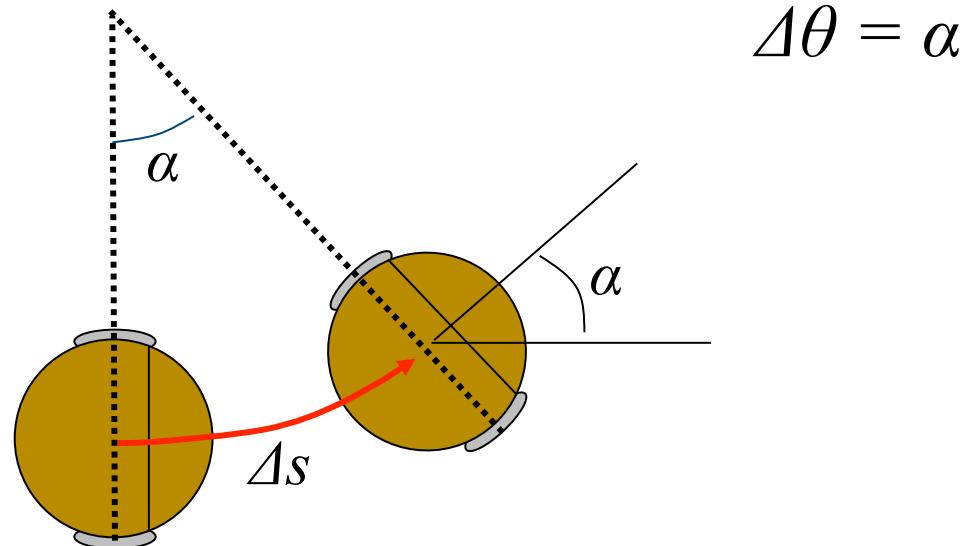
$$\Delta s = \frac{\Delta s_r + \Delta s_l}{2}$$





# Modeling Motion

- To calculate the change in angle  $\Delta\theta$ , observe that it equals the rotation about the circular arc's center point





# Modeling Motion

- So we solve for  $\alpha$  by equating  $\alpha$  from the first two equations:

$$\Delta s_l = R\alpha \quad \Delta s_r = (R+2L)\alpha$$

This results in:

$$\begin{aligned}\Delta s_l / R &= \Delta s_r / (R+2L) \\ (R+2L) \Delta s_l &= R \Delta s_r \\ 2L \Delta s_l &= R (\Delta s_r - \Delta s_l) \\ \frac{2L \Delta s_l}{(\Delta s_r - \Delta s_l)} &= R\end{aligned}$$



# Modeling Motion

- Substitute  $R$  into

$$\begin{aligned}\alpha &= \Delta s_l / R \\ &= \Delta s_l (\Delta s_r - \Delta s_l) / (2L \Delta s_l) \\ &= \frac{(\Delta s_r - \Delta s_l)}{2L}\end{aligned}$$

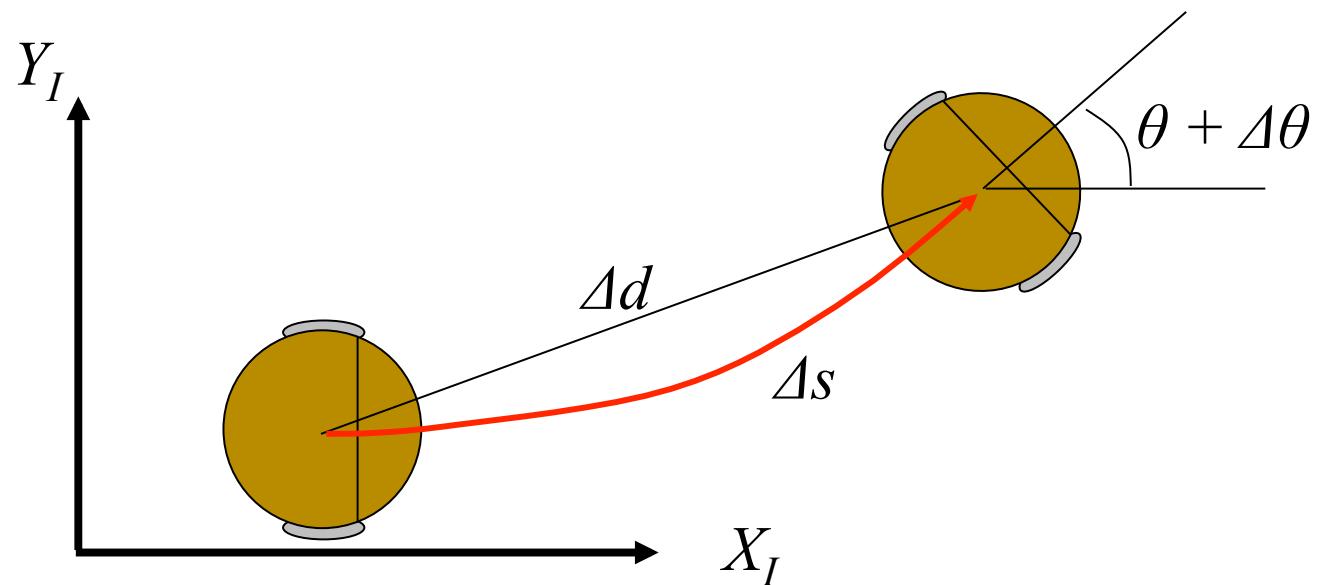
So...

$$\Delta\theta = \frac{(\Delta s_r - \Delta s_l)}{2L}$$



# Modeling Motion

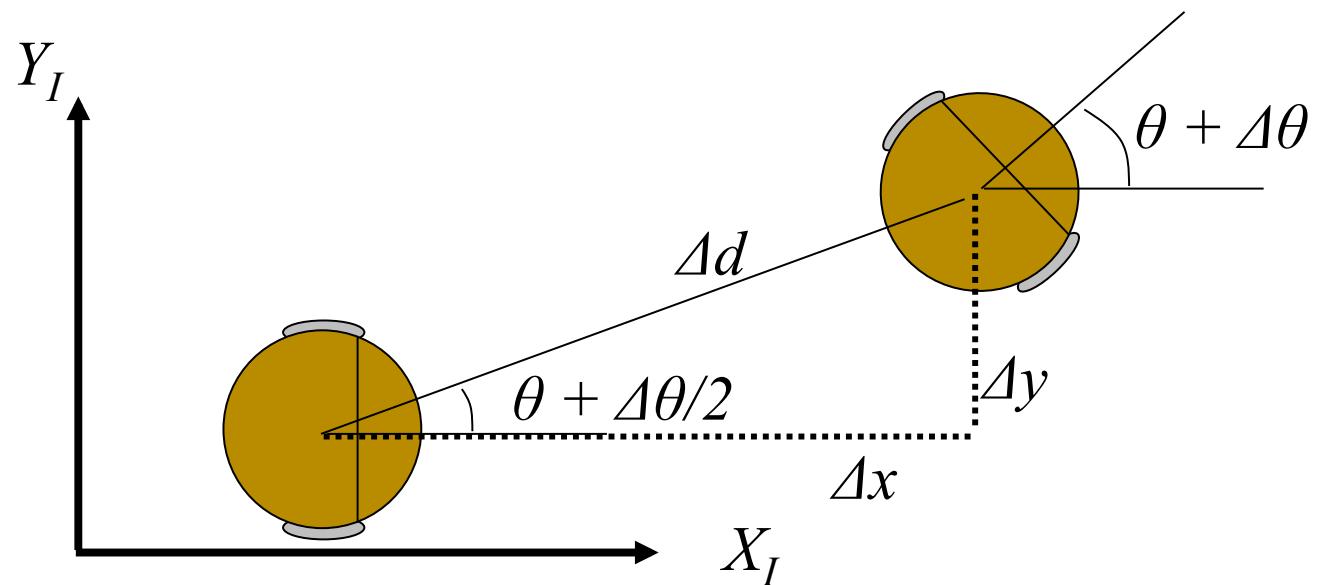
- Now that we have  $\Delta\theta$  and  $\Delta s$ , we can calculate the position change in global coordinates.
  - We use a new segment of length  $\Delta d$ .





# Modeling Motion

- Now calculate the change in position as a function of  $\Delta d$ .



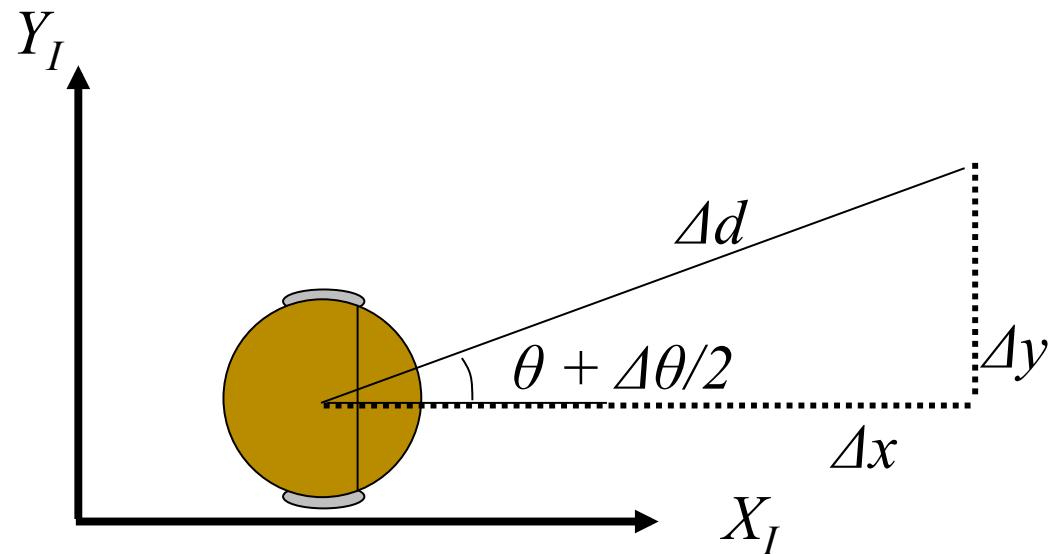


# Modeling Motion

- Using Trig:

$$\Delta x = \Delta d \cos(\theta + \Delta\theta/2)$$

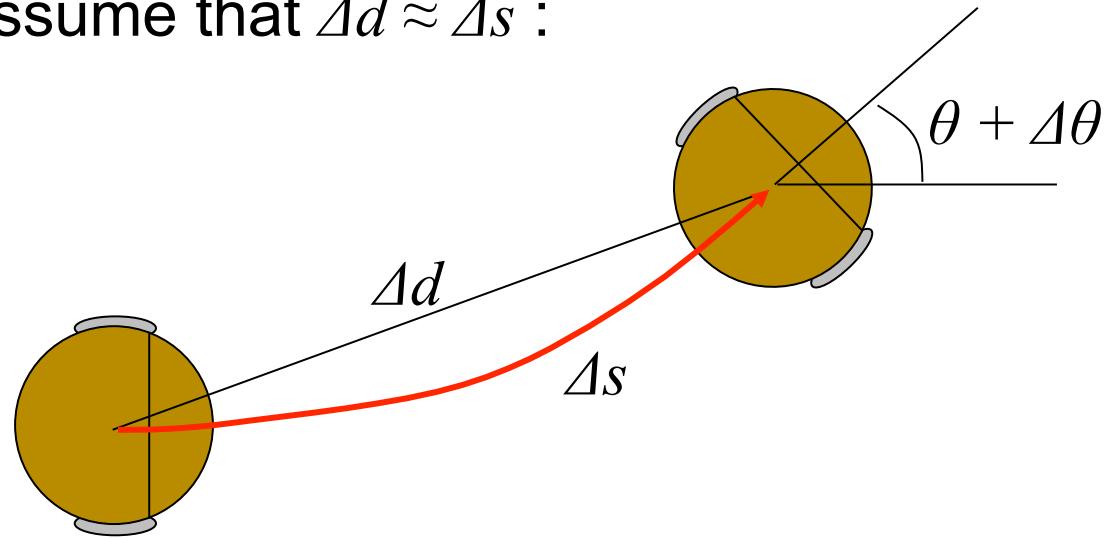
$$\Delta y = \Delta d \sin(\theta + \Delta\theta/2)$$





# Modeling Motion

- Now if we assume that the motion is small, then we can assume that  $\Delta d \approx \Delta s$  :



- So...

$$\Delta x = \Delta s \cos(\theta + \Delta\theta/2)$$

$$\Delta y = \Delta s \sin(\theta + \Delta\theta/2)$$



# Modeling Motion

- Summary:

$$\Delta x = \Delta s \cos(\theta + \Delta\theta/2)$$

$$\Delta y = \Delta s \sin(\theta + \Delta\theta/2)$$

$$\Delta\theta = \frac{\Delta s_r - \Delta s_l}{2L}$$

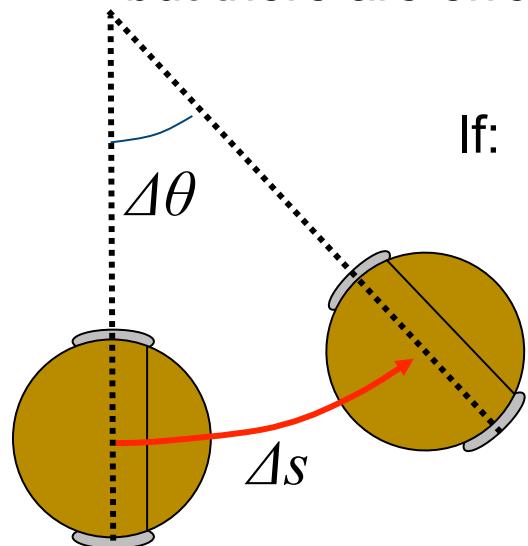
$$\Delta s = \frac{\Delta s_r + \Delta s_l}{2}$$

$$X_t = f(x, y, \theta, \Delta s_r, \Delta s_l) = \begin{bmatrix} x \\ y \\ \theta \end{bmatrix} + \begin{bmatrix} \frac{\Delta s_r + \Delta s_l}{2} \cos\left(\theta + \frac{\Delta s_r - \Delta s_l}{4L}\right) \\ \frac{\Delta s_r + \Delta s_l}{2} \sin\left(\theta + \frac{\Delta s_r - \Delta s_l}{4L}\right) \\ \frac{\Delta s_r - \Delta s_l}{2L} \end{bmatrix}$$



# Modeling Uncertainty in Motion

- Let's consider wheel rotation measurement errors, and see how they propagate into positioning errors.
  - Example: the robot actually moved forward 1 m on the x axis, but there are errors in measuring this.



$$\Delta s = 1 + e_s$$

$$\Delta \theta = \theta + e_\theta$$

where  $e_s$  and  $e_\theta$  are error terms



# Modeling Uncertainty in Motion

- According to the following equations, the error  $e_s = 0.001\text{m}$  produces errors in the direction of motion.

$$\Delta x = \Delta s \cos(\theta + \Delta\theta/2)$$

$$\Delta y = \Delta s \sin(\theta + \Delta\theta/2)$$

- However, the  $\Delta\theta$  term affects each direction differently.  
If  $e_\theta = 2 \text{ deg}$  and  $e_s = 0 \text{ meters}$ , then:

$$\cos(\theta + \Delta\theta/2) = 0.9998$$

$$\sin(\theta + \Delta\theta/2) = 0.0175$$



# Modeling Uncertainty in Motion

- So

$$\Delta x = 0.9998$$

$$\Delta y = 0.0175$$

- But the robot actually went to  $x = 1, y = 0$ , so the errors in each direction are

$$\Delta x = +0.0002$$

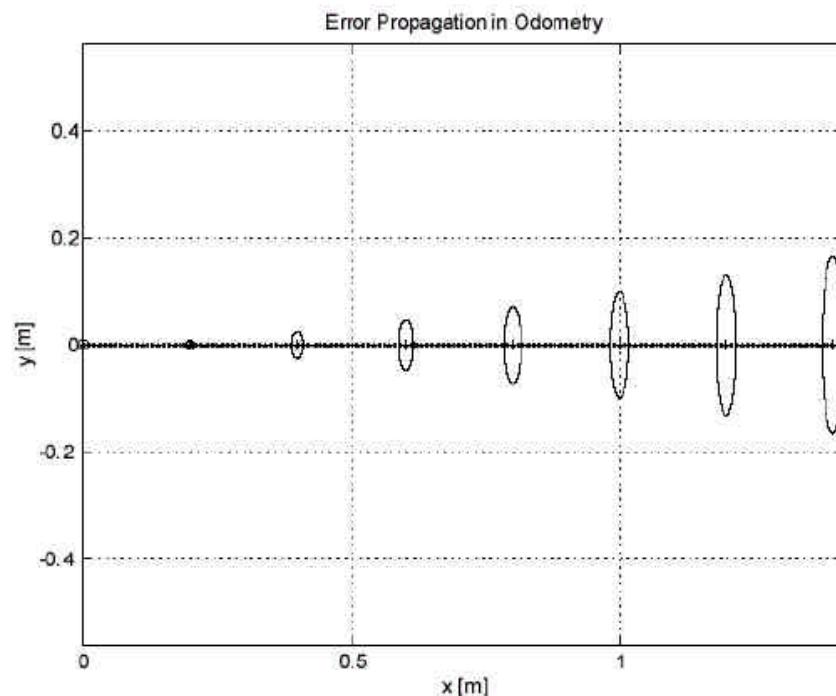
$$\Delta y = -0.0175$$

- *THE ERROR IS BIGGER IN THE “Y” DIRECTION!*



# Modeling Uncertainty in Motion

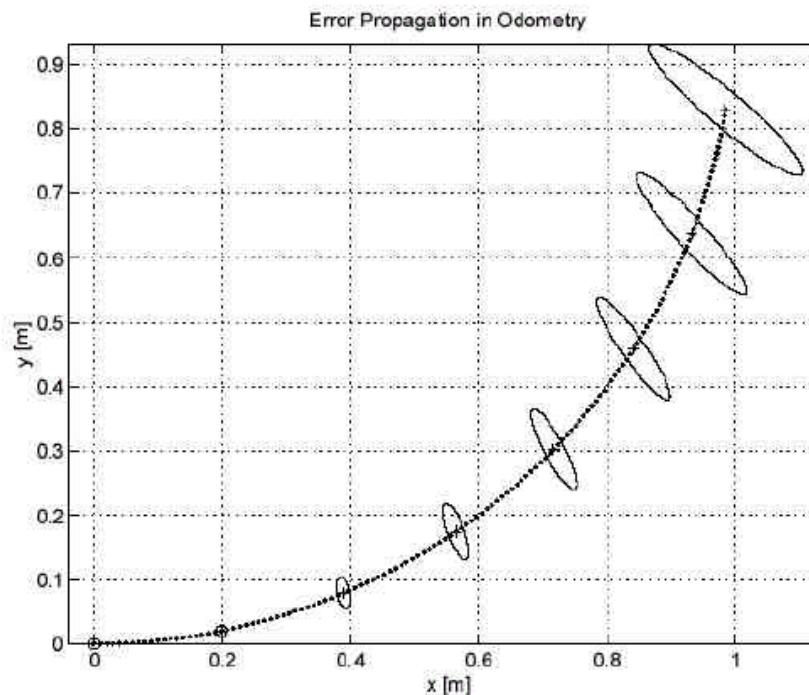
- Errors perpendicular to the direction grow much larger.





# Modeling Uncertainty in Motion

- Error ellipse does not remain perpendicular to direction.





# Odometry Kinematics

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# The VideoRay MicroROV

- ROV Specs
  - Two horizontal thrusters, one vertical
  - Forward facing color camera
  - Rear facing B/W camera
  - 1.4 m/s (2.6 knots) speed
  - 152m depth rating
  - **Depth & Heading** sensors
  - SeaSprite Scanning Sonar





# The VideoRay MicroROV

## ■ ROV Modeling

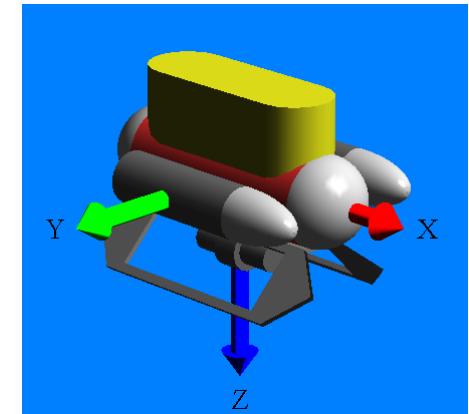
$$\begin{aligned}
m[\dot{u} - vr + wq - x_G(q^2 + r^2) + y_G(pq - \dot{r}) + z_G(pr + \dot{q})] &= X \\
m[\dot{v} - wp + ur - y_G(r^2 + p^2) + z_G(qr - \dot{p}) + x_G(qp + \dot{r})] &= Y \\
m[\dot{w} - uq + vp - z_G(p^2 + q^2) + x_G(rp - \dot{q}) + y_G(rq + \dot{p})] &= Z \\
I_x \dot{p} + (I_z - I_y)qr - (\dot{r} + pq)I_{xz} + (r^2 - q^2)I_{yz} + (pr - \dot{q})I_{xy} \\
+ m[y_G(\dot{w} - uq + vp) - z_G(\dot{v} - wp + ur)] &= K \\
I_y \dot{q} + (I_x - I_z)rp - (\dot{p} + qr)I_{xy} + (p^2 - r^2)I_{zx} + (qp - \dot{r})I_{yz} \\
+ m[z_G(\dot{u} - vr + wq) - x_G(\dot{w} - uq + vp)] &= M \\
I_z \dot{r} + (I_y - I_x)pq - (\dot{q} + rp)I_{yz} + (q^2 - p^2)I_{xy} + (rq - \dot{p})I_{zx} \\
+ m[x_G(\dot{v} - wp + ur) - y_G(\dot{u} - vr + wq)] &= N
\end{aligned}$$



# Equations of Motion

- 6 degrees of freedom (DOF):
- State vectors:
  - body-fixed velocity vector:
  - earth-fixed pos. vector:

$$\begin{aligned}\nu &= \left[ \nu_1^T, \nu_2^T \right]^T = [u, v, w, p, q, r]^T \\ \eta &= \left[ \eta_1^T, \eta_2^T \right]^T = [x, y, z, \phi, \theta, \psi]^T\end{aligned}$$



DOF	Surge	Sway	Heave	Roll	Pitch	Yaw
Velocities	$u$	$v$	$w$	$p$	$q$	$r$
Position & Attitude	$x$	$y$	$z$	$\phi$	$\theta$	$\psi$
Forces & Moments	$X$	$Y$	$Z$	$K$	$M$	$N$



# Equations of Motion

# Initial Assumptions

- The ROV will usually move with low velocity when on mission
  - Almost three planes of symmetry;
  - Vehicle is assumed to be performing non-coupled motions.

[W. Wang et al., 2006]



# Equations of Motion

- Horizontal Plane:

$$\begin{aligned}m_{11}\dot{u} &= -m_{22}vr + X_u u + X_{u|u|}u|u| + X \\m_{22}\dot{v} &= m_{11}ur + Y_v v + Y_{v|v|}v|v|, \\I\dot{r} &= N_rr + N_{r|r|}r|r| + N,\end{aligned}$$

- Vertical Plan:

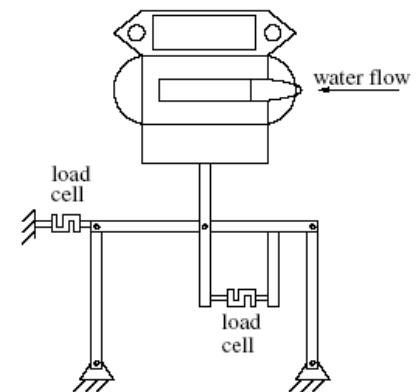
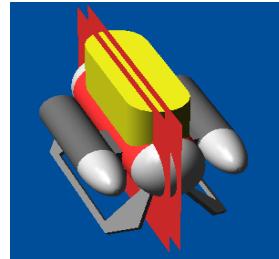
$$m_{33}\dot{w} = Z_w w + Z_{w|w|}w|w| + Z$$

[W. Wang et al., 2006]



# Theory vs. Experiment

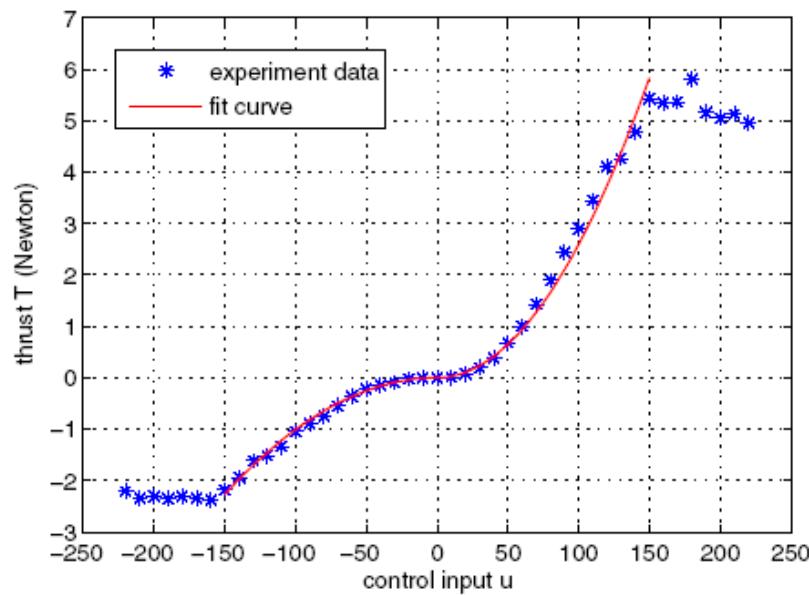
- Coefficients for the dynamic model are pre-calculated using strip theory;
- A series of tests are carried out to validate the hydrodynamic coefficients, including
  - Propeller mapping
  - Added mass coefficients
  - Damping coefficients





# Propeller Thrust Mapping

- The forward thrust can be represented as:

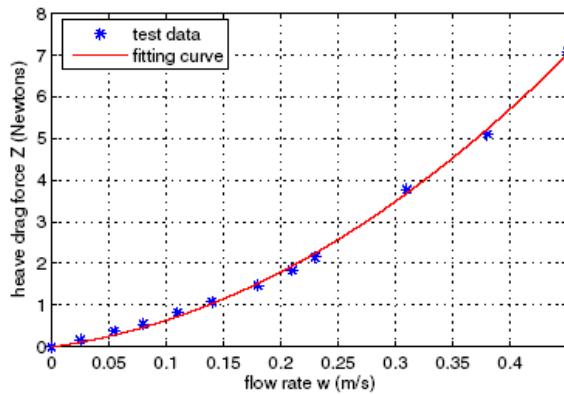




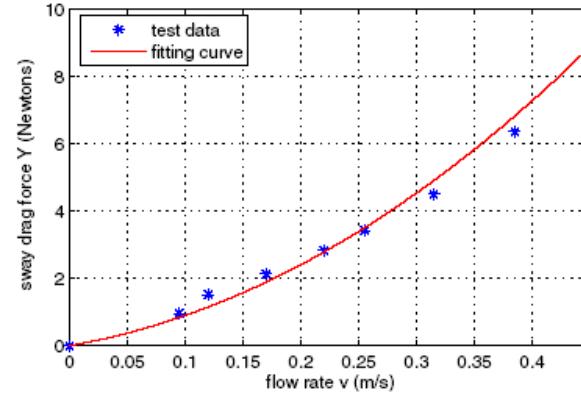
# Direct Drag Forces

- The drag can be modeled as non linear functions

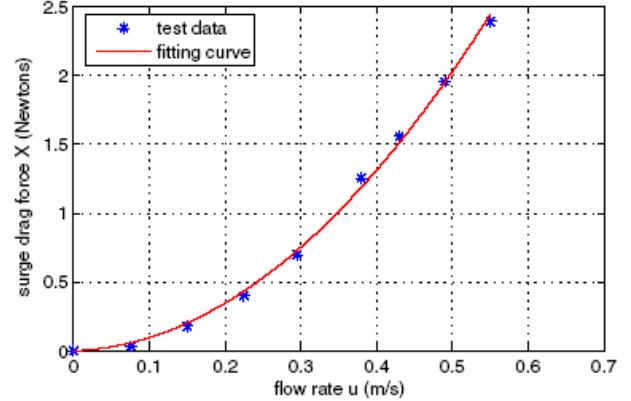
Drag in Heave (Z)  
Direction



Drag in Sway (Y)  
Direction



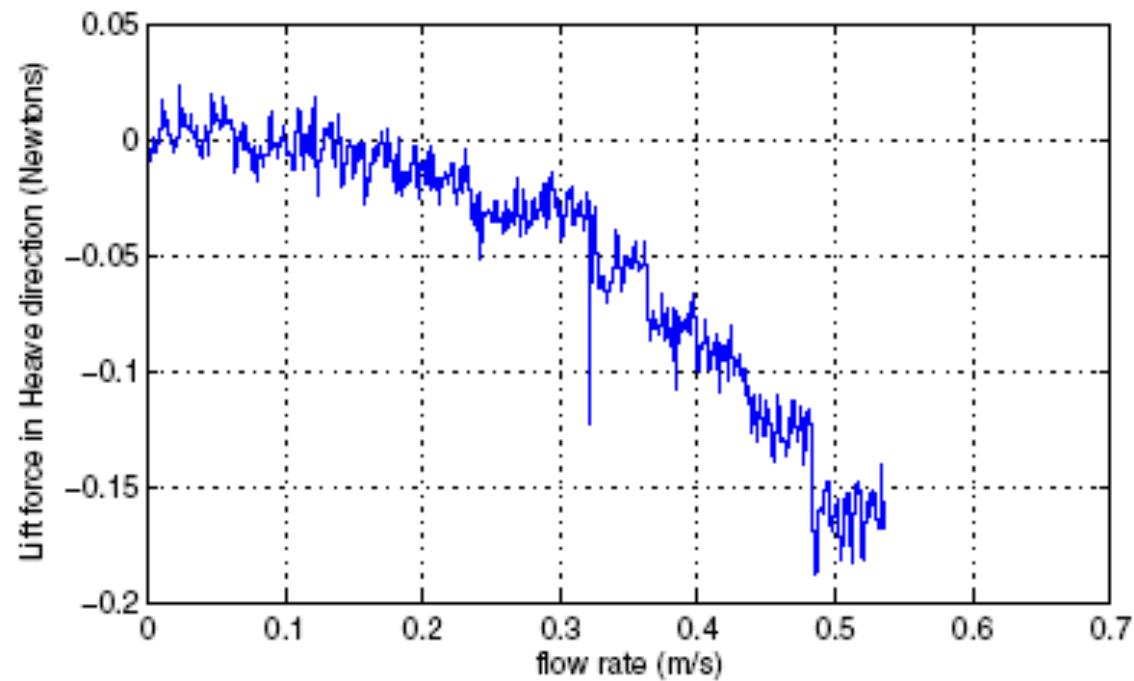
Drag in Surge (X)  
Direction





# Perpendicular Drag Forces

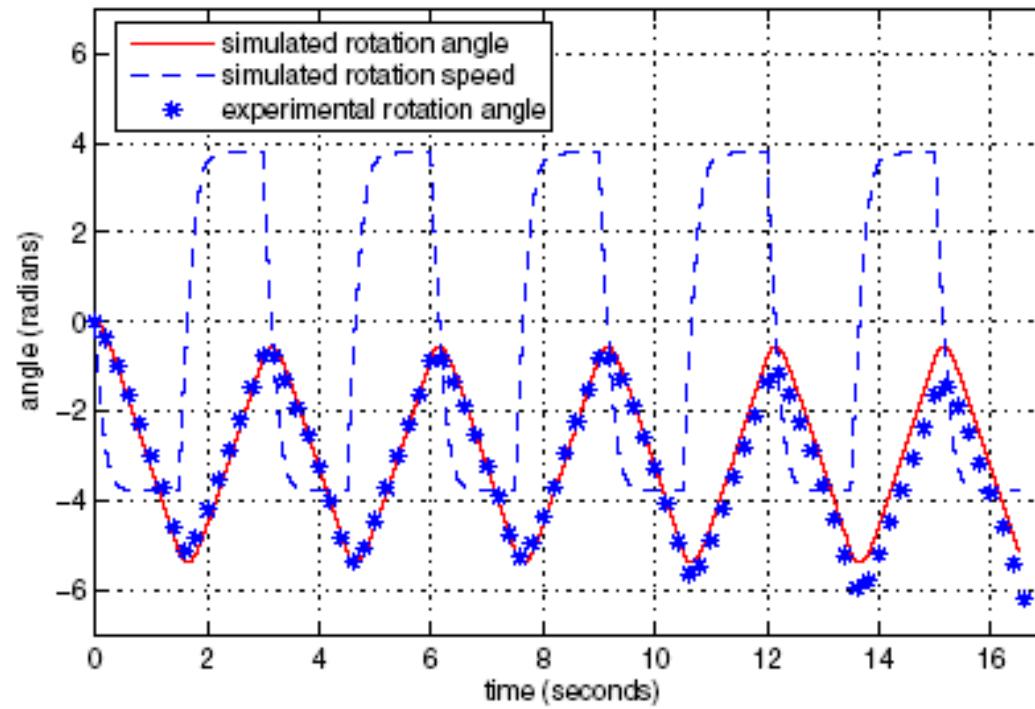
- Heave (Z) drag from surge speed





# Model Verification

- Yaw Verification





# Model Verification

## ▪ Surge Verification

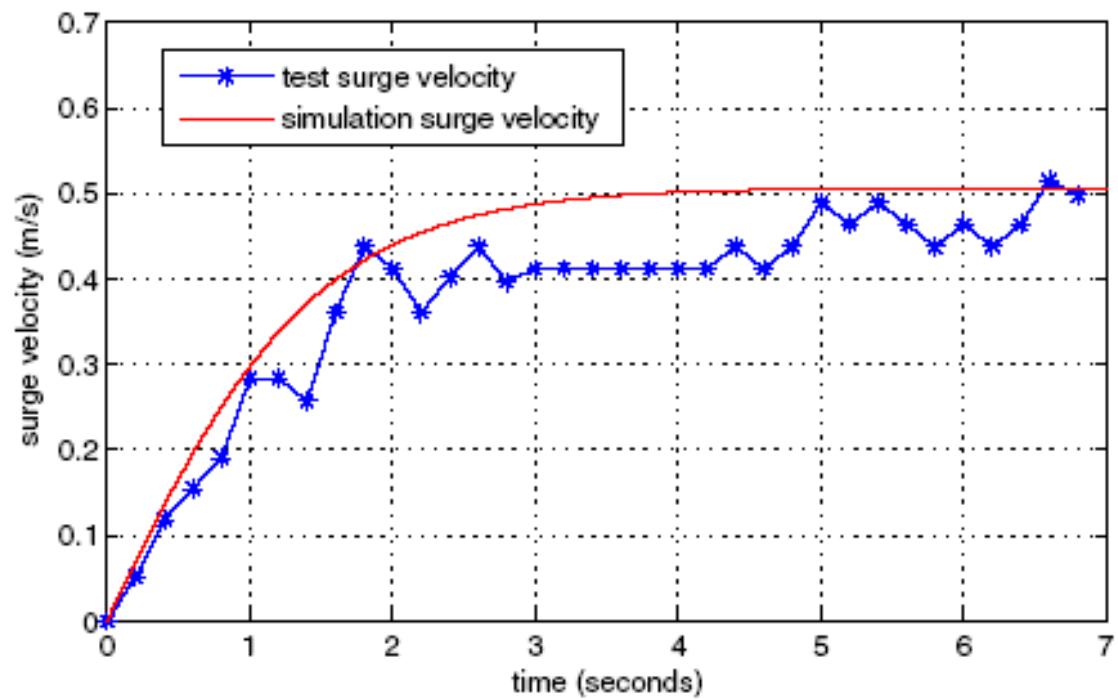
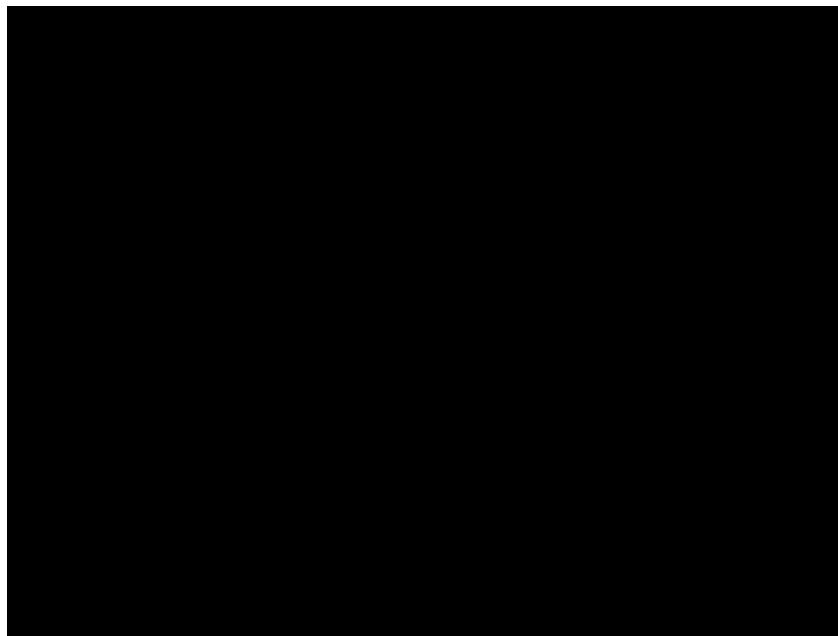


Fig. 14. Surge test experiment data and simulation result



# Autonomous Control





# Odometry Kinematics

1. Odometry & Dead Reckoning
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# Odometry on the Jaguar

- Goals:
  - Calculate the resulting robot position and orientation from wheel encoder measurements.
  - Display them with the Matlab plot function



# Odometry on the Jaguar

- Method cont':
  - Make use of the fact that your encoder has resolution of 4096 pulses per revolution. Be able to convert this to a distance travelled by the wheel.
$$r\varphi_r = \Delta s_r$$
  - Given the distance travelled by each wheel, we can calculate the change in the robot's distance and orientation.

$$\Delta s = \frac{\Delta s_r + \Delta s_l}{2} \quad \Delta \theta = \frac{(\Delta s_r - \Delta s_l)}{2L}$$



# Odometry on the Jaguar

- Method cont':
  - Now you should be able to update the position/ orientation in global coordinates.

$$\Delta x = \Delta s \cos(\theta + \Delta\theta/2)$$

$$\Delta y = \Delta s \sin(\theta + \Delta\theta/2)$$