

# Introduction to Cognitive Robotics

## Module 3: Mobile Robots

### Lecture 5: Kinematics of a two-wheel differential drive robot

David Vernon  
Carnegie Mellon University Africa

[www.vernon.eu](http://www.vernon.eu)

# Wheeled Locomotion

# of wheels	Arrangement	Description	Typical examples
2		One steering wheel in the front, one traction wheel in the rear	Bicycle, motorcycle
		Two-wheel differential drive with the center of mass (COM) below the axle	Cye personal robot
3		Two-wheel centered differential drive with a third point of contact	Nomad Scout, smartRob EPFL
		Two independently driven wheels in the rear/front, 1 unpowered omnidirectional wheel in the front/rear	Many indoor robots, including the EPFL robots Pygmalion and Alice
		Two connected traction wheels (differential) in rear, 1 steered free wheel in front	Piaggio minitrucks
		Two free wheels in rear, 1 steered traction wheel in front	Neptune (Carnegie Mellon University), Hero-1
		Three motorized Swedish or spherical wheels arranged in a triangle; omnidirectional movement is possible	Stanford wheel Tribolo EPFL, Palm Pilot Robot Kit (CMU)
		Three synchronously motorized and steered wheels; the orientation is not controllable	"Synchro drive" Denning MRV-2, Georgia Institute of Technology, I-Robot B24, Nomad 200

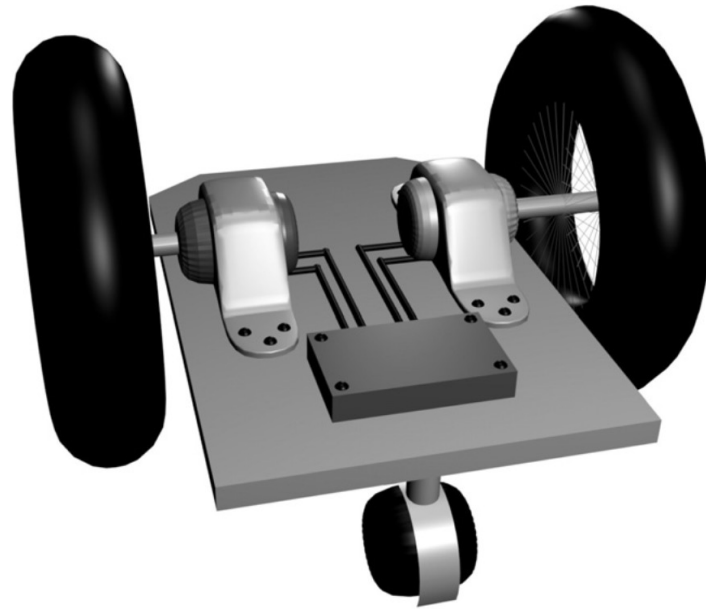
# of wheels	Arrangement	Description	Typical examples
4		Two motorized wheels in the rear, 2 steered wheels in the front; steering has to be different for the 2 wheels to avoid slipping/skidding.	Car with rear-wheel drive
		Two motorized and steered wheels in the front, 2 free wheels in the rear; steering has to be different for the 2 wheels to avoid slipping/skidding.	Car with front-wheel drive
		Four steered and motorized wheels	Four-wheel drive, four-wheel steering Hyperion (CMU)
		Two traction wheels (differential) in rear/front, 2 omnidirectional wheels in the front/rear	Charlie (DMT-EPFL)
		Four omnidirectional wheels	Carnegie Mellon Uranus
		Two-wheel differential drive with 2 additional points of contact	EPFL Khepera, Hyperbot Chip
		Four motorized and steered castor wheels	Nomad XR4000

# of wheels	Arrangement	Description	Typical examples
6		Two motorized and steered wheels aligned in center, 1 omnidirectional wheel at each corner	First
		Two traction wheels (differential) in center, 1 omnidirectional wheel at each corner	Terregator (Carnegie Mellon University)
Icons for the each wheel type are as follows:			
	unpowered omnidirectional wheel (spherical, castor, Swedish);		
	motorized Swedish wheel (Stanford wheel);		
	unpowered standard wheel;		
	motorized standard wheel;		
	motorized and steered castor wheel;		
	steered standard wheel;		
	connected wheels.		

We will study two-wheel differential drive locomotion

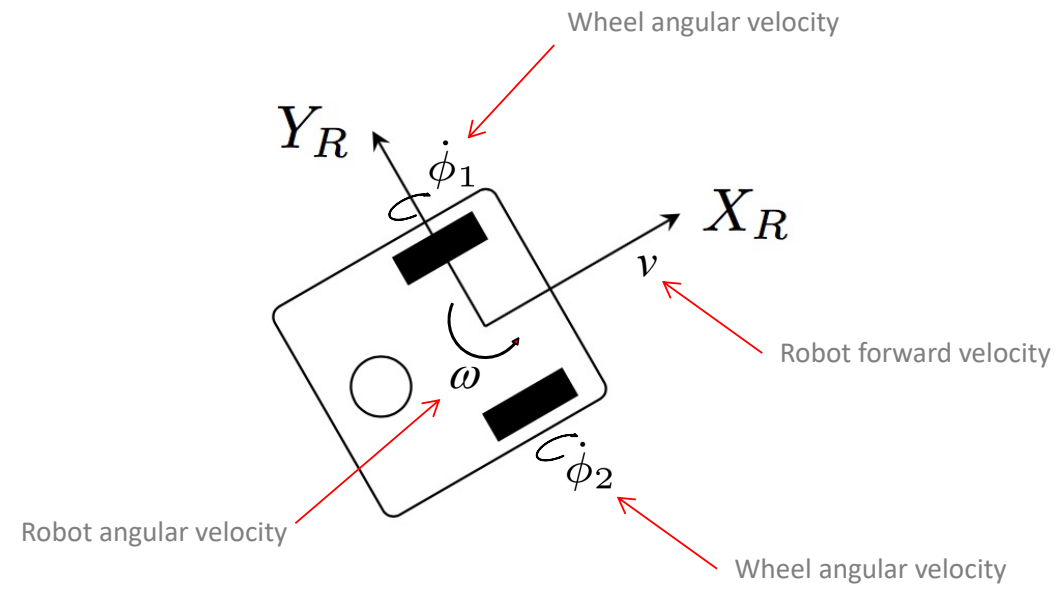
Source: R. Siegwart and I. R. Nourbakhsh, *Introduction to Autonomous Mobile Robots*, MIT Press, 2004

# Wheeled Locomotion



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

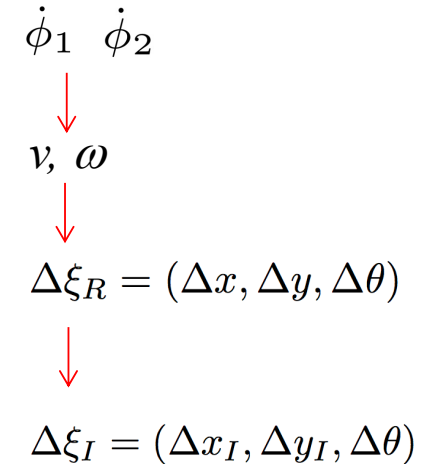
# Wheeled Locomotion



# Odometry-based Position Estimation

We need to know how to compute these three transformations

- Measure the angular velocities of the left and right wheels
- Compute the **instantaneous velocities** in the robot frame of reference
- Compute the **displacement** and **change in orientation** (in a given time interval) in the **robot frame of reference  $R$**
- Compute the **displacement** and **change in orientation** (in a given time interval) in the **global frame of reference** (inertial frame of reference  $I$ )
- Update the position of the robot with respect to its previous position
- Repeat update (e.g. every 100 ms)



# Instantaneous velocities in the robot frame of reference

We use the robot's **forward kinematics**

- Given the **angular velocity** of the wheels and the **geometry of the robot**

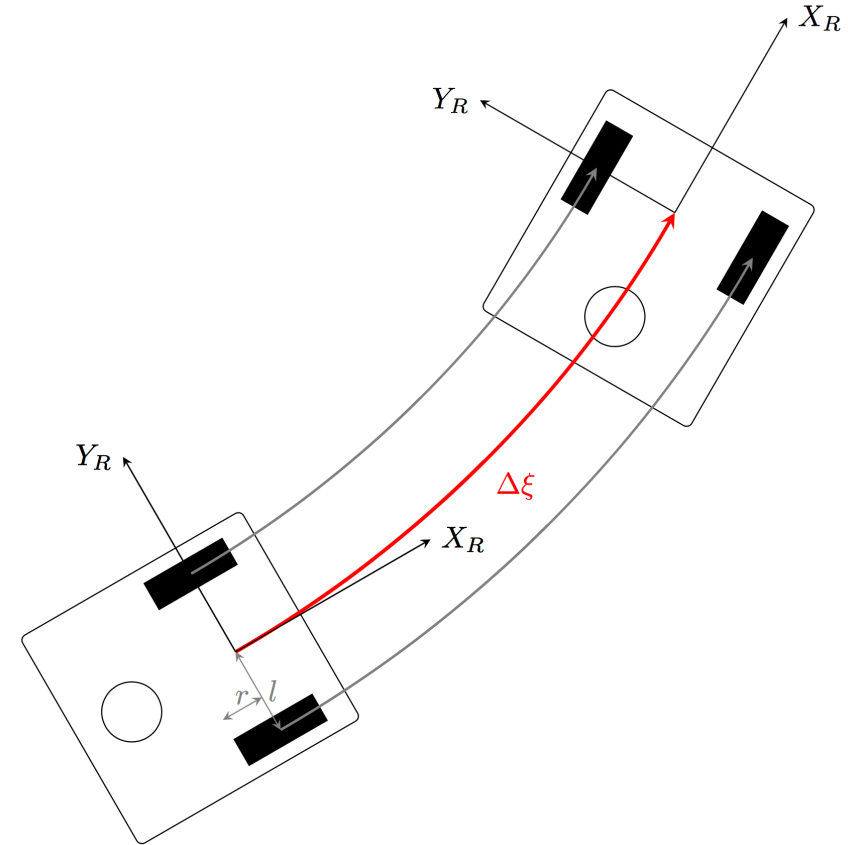
$\dot{\phi}_1$  right wheel angular velocity

$\dot{\phi}_2$  left wheel angular velocity

$r$  wheel radius

$l$  distance of the wheel from the origin of the robot frame of reference

- Determine the **change in pose** of the robot  
 $\Delta\xi = (\Delta x, \Delta y, \Delta\theta)$



# Odometry-based Position Estimation

## Overall approach

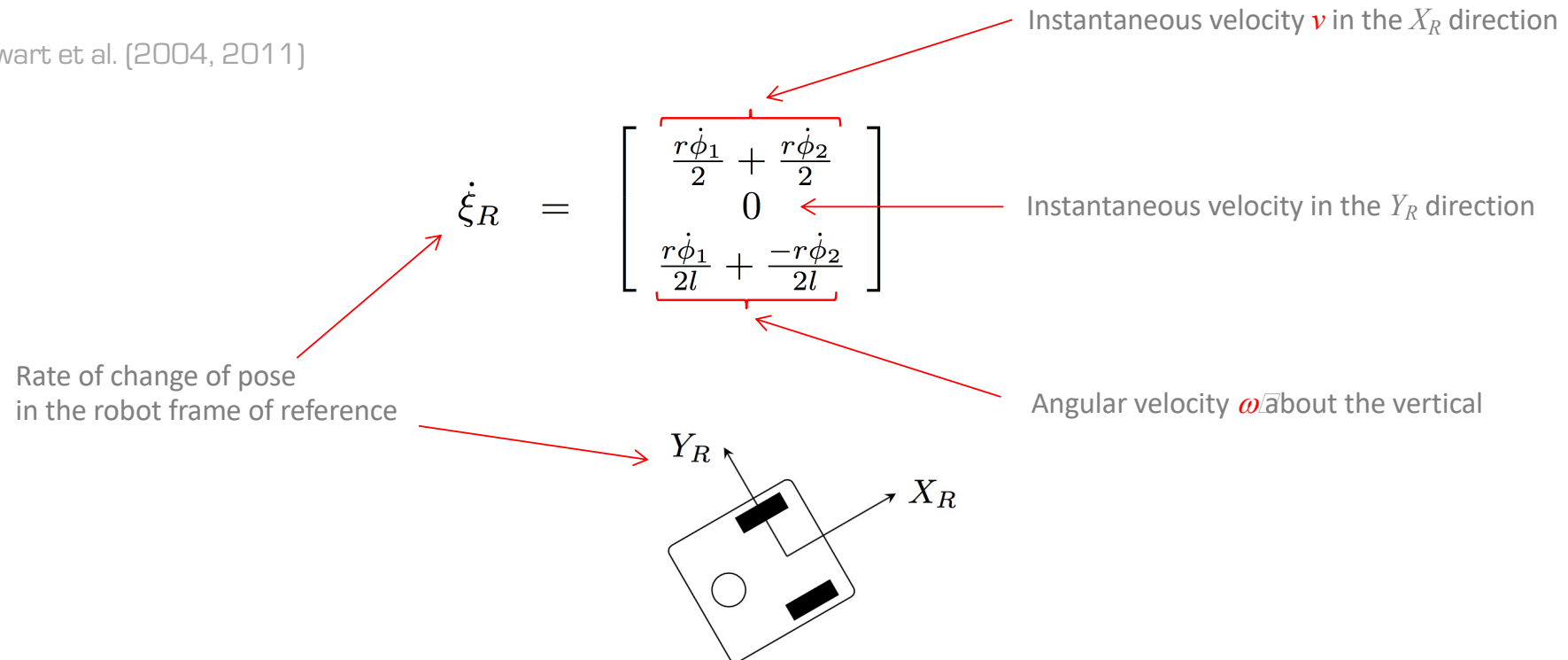
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- Repeat update (e.g. every 100 ms)

$$\begin{array}{cc} \dot{\phi}_1 & \dot{\phi}_2 \\ \downarrow & \\ v, \omega & \end{array}$$

# Instantaneous velocities in the robot frame of reference

The motion of the robot in the **local** robot frame of reference  $R$  due to the rotation of the wheels is given by:

Also see Siegwart et al. [2004, 2011]





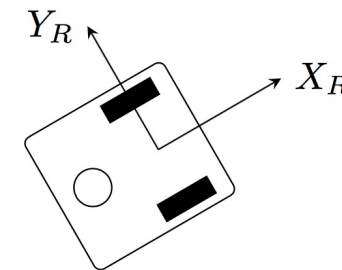
# Instantaneous velocities in the robot frame of reference

The motion of the robot in the **local** robot frame of reference  $R$  due to the rotation of the wheels is given by:

Also see Siegwart and Nourkbakhsh. (2004, p. 52, 2011)

$$\dot{\xi}_R = \begin{bmatrix} \frac{r\dot{\phi}_1}{2} + \frac{r\dot{\phi}_2}{2} \\ 0 \\ \frac{r\dot{\phi}_1}{2l} + \frac{-r\dot{\phi}_2}{2l} \end{bmatrix}$$

Instantaneous velocity  $v$  in the  $X_R$  direction



Contribution to forward velocity by the right wheel

If the **left** wheel is stopped and the **right** wheel spins, then the instantaneous velocity of the origin of the robot's frame of reference – written  $\{R\}$  – will be **half** the angular velocity times the radius. Why half? Because the origin is half-way between the **right** moving wheel and the **left** stopped wheel.

Contribution to forward velocity by the left wheel

If the **right** wheel is stopped and the **left** wheel spins, then the instantaneous velocity of the origin of the robot's frame of reference – written  $\{R\}$  – will be **half** the angular velocity times the radius. Why half? Because the origin is half-way between the **left** moving wheel and the **right** stopped wheel.

# Instantaneous velocities in the robot frame of reference

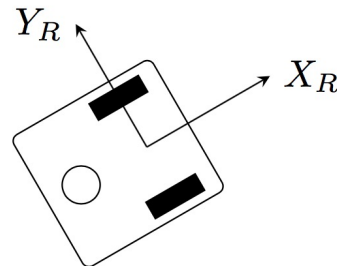
The motion of the robot in the **local** robot frame of reference  $R$  due to the rotation of the wheels is given by:

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← Instantaneous velocity in the  $Y_R$  direction

Must be zero because the robot cannot move along the line joining the two wheels, i.e. in the  $Y_R$  direction



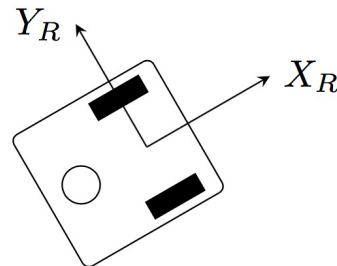
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Angular velocity  $\omega$  about the vertical

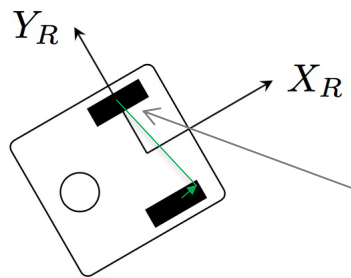


# Instantaneous velocities in the robot frame of reference

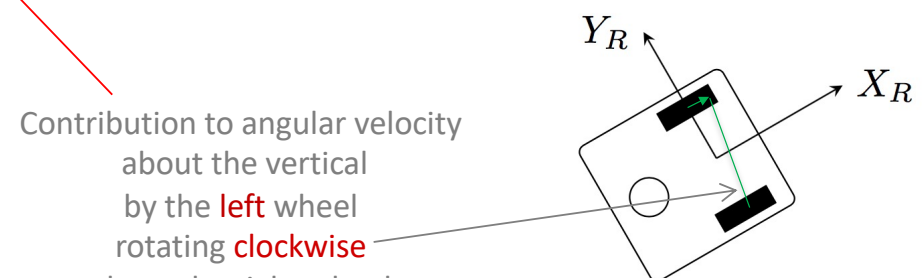
The motion of the robot in the **local** robot frame of reference  $R$  due to the rotation of the wheels is given by:

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Contribution to angular velocity about the vertical by the **right** wheel rotating **anticlockwise** about the left wheel



Contribution to angular velocity about the vertical by the **left** wheel rotating **clockwise** about the right wheel (hence the **minus** sign)

# Odometry-based Position Estimation

## Overall approach

- Measure the angular velocities of the left and right wheels
- Compute the instantaneous velocities in the robot frame of reference
- Compute the **displacement** and **change in orientation** (in a given time interval) in the **robot frame of reference  $R$**
- Compute the displacement and change in orientation (in a given time interval) in the global frame of reference (inertial frame of reference  $I$ )
- Update the position of the robot with respect to its previous position
- Repeat update (e.g. every 100 ms)

$v, \omega$



$$\Delta\xi_R = (\Delta x, \Delta y, \Delta\theta)$$

# Displacement and change in orientation in the robot frame of reference

We need the change in **position** and **orientation** of the robot  $\Delta\xi = (\Delta x, \Delta y, \Delta\theta)$  rather than its velocity

Unfortunately, we cannot integrate  $\dot{\xi}_R = \begin{bmatrix} \frac{r\dot{\phi}_1}{2} + \frac{r\dot{\phi}_2}{2} \\ 0 \\ \frac{r\dot{\phi}_1}{2l} + \frac{-r\dot{\phi}_2}{2l} \end{bmatrix}$  in the general case

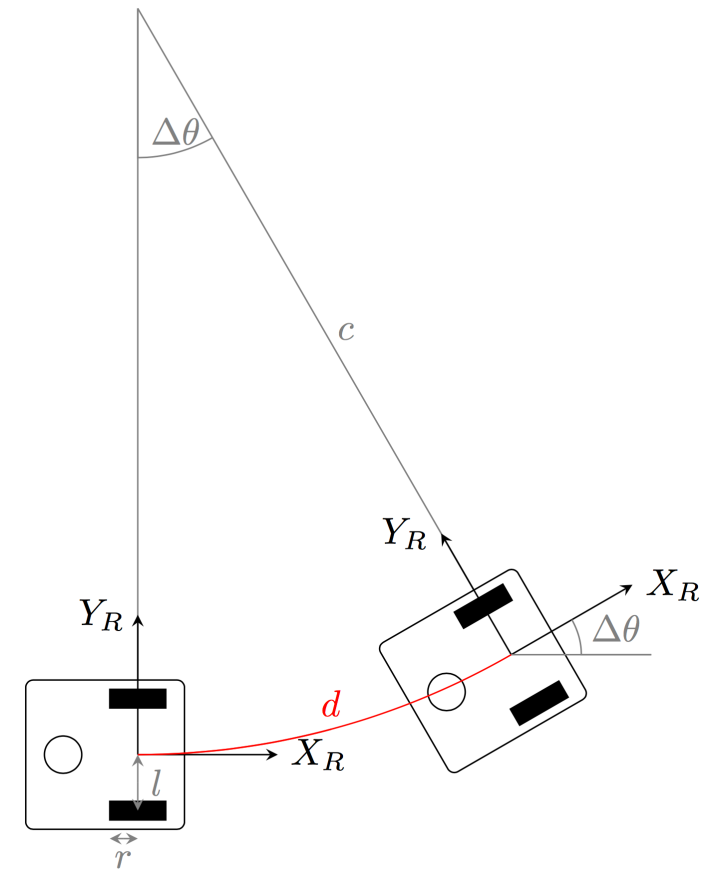
When the robot kinematic constraints (e.g. the rate of change of pose for the two-wheel differential drive robot) is specified with a differential relationship which is not integrable to define the constraint in terms of position variables only, we say the robot is **nonholonomic**

But we can do it for some important special cases, e.g., **constant angular velocity of the wheels**

# Displacement and change in orientation in the robot frame of reference

If the angular velocities of the wheels are constant, the path of the robot is constrained to be on a **circular arc** with centre known as the **instantaneous centre of rotation ICR**

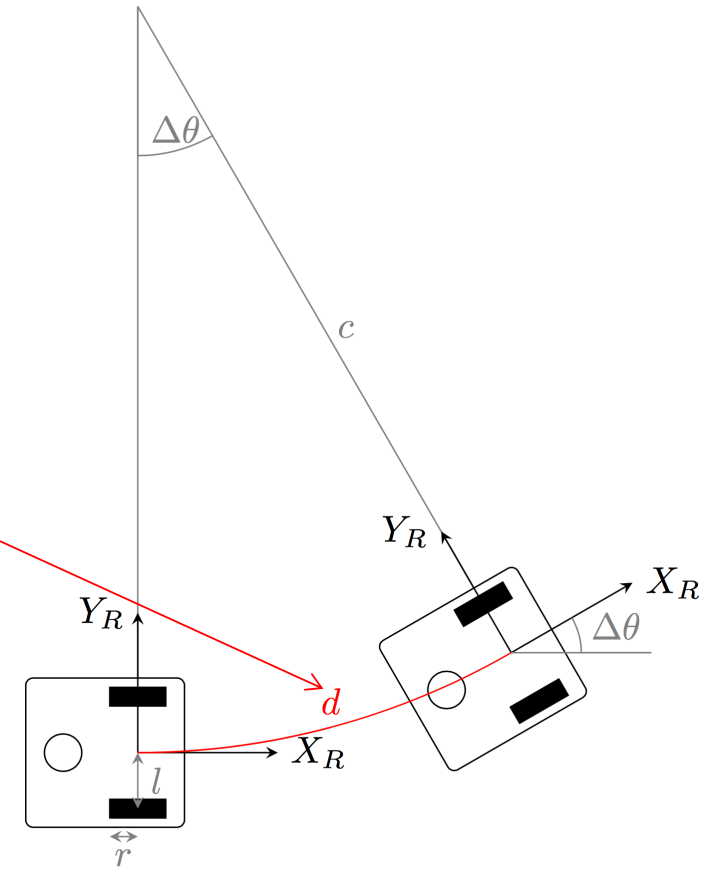
In this case, we can derive an expression for the change in pose in terms of wheel angular velocity and robot geometry



# Displacement and change in orientation in the robot frame of reference

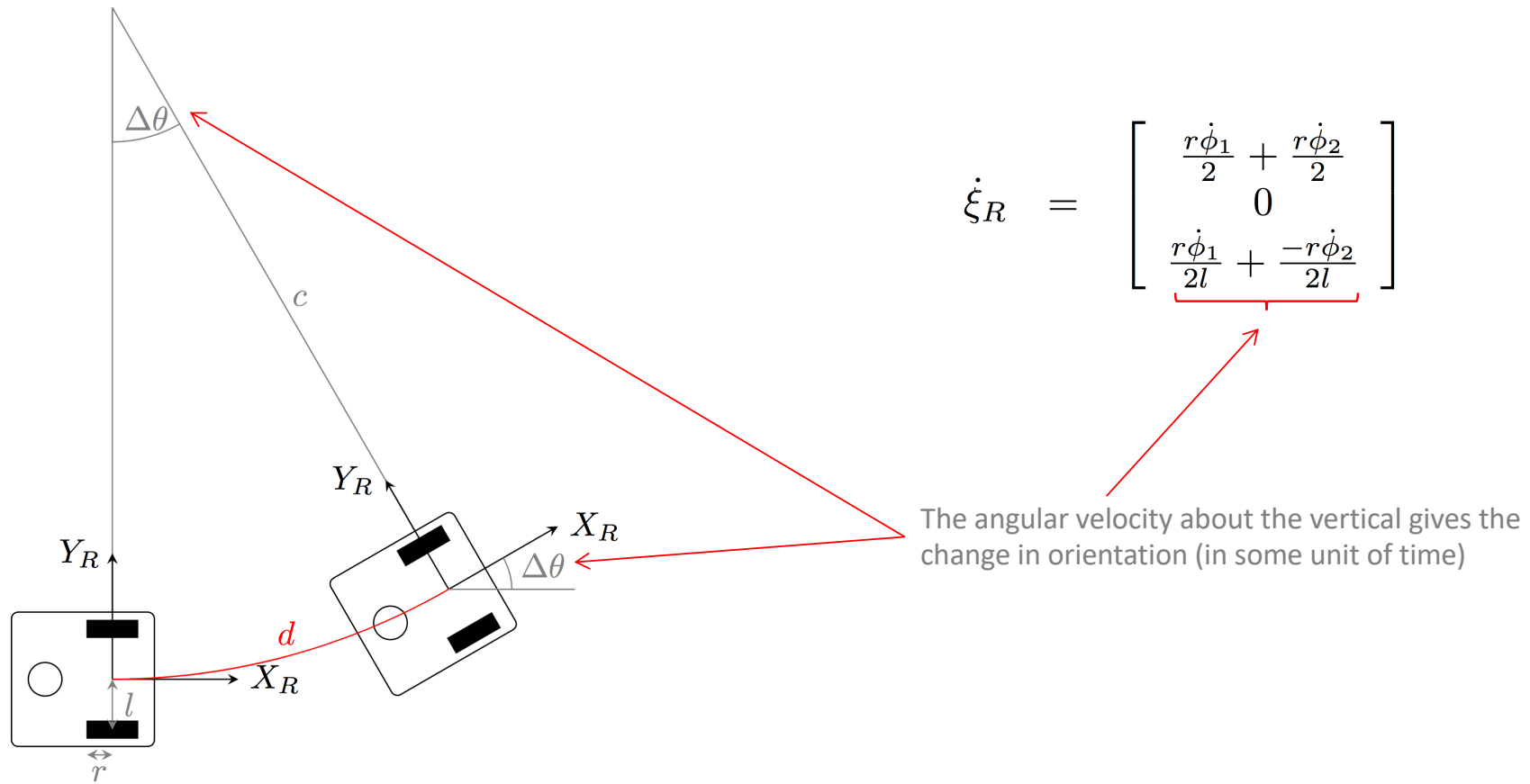
The instantaneous velocity in the  $X_R$  direction gives the distance  $d$  travelled in some unit of time

$$\dot{\xi}_R = \begin{bmatrix} \frac{r\dot{\phi}_1}{2} + \frac{r\dot{\phi}_2}{2} \\ 0 \\ \frac{r\dot{\phi}_1}{2l} + \frac{-r\dot{\phi}_2}{2l} \end{bmatrix}$$





# Displacement and change in orientation in the robot frame of reference



# Displacement and change in orientation in the robot frame of reference

We have two known values:

$$d = \frac{r\dot{\phi}_1}{2} + \frac{r\dot{\phi}_2}{2}$$

$$\Delta\theta = \frac{r\dot{\phi}_1}{2l} + \frac{-r\dot{\phi}_2}{2l}$$

Since the angular velocities of the wheels,  $\dot{\phi}_1$  and  $\dot{\phi}_2$ , are constant,  $d$  is the length of an arc on a circle of radius  $c$  subtended by the angle  $\Delta\theta$

$$\Delta\theta = \frac{d}{c}$$

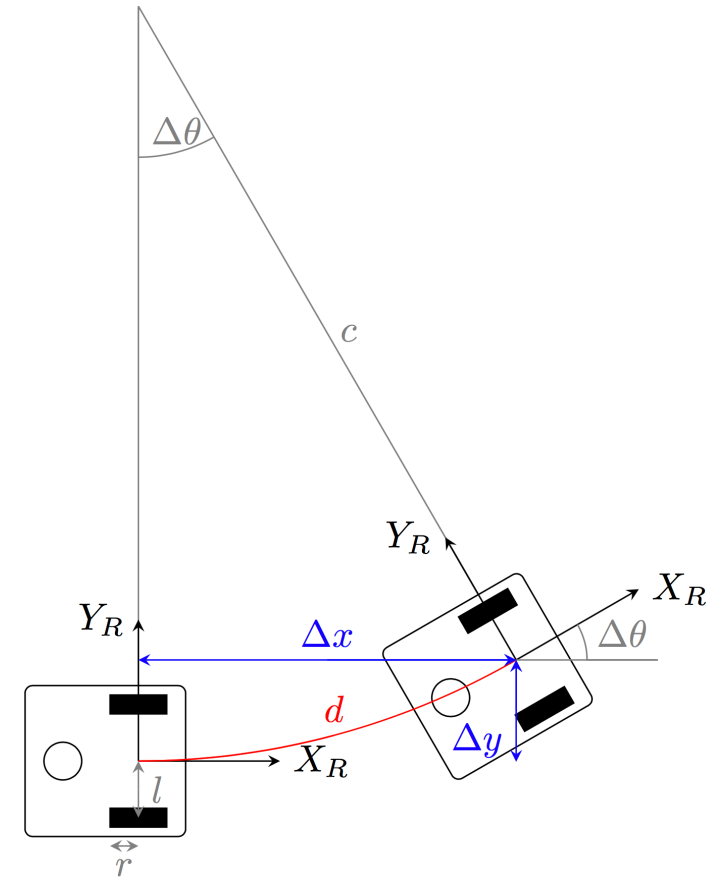
Thus

$$c = \frac{d}{\Delta\theta}$$

and

$$\Delta x = c \sin \Delta\theta$$

$$\Delta y = c - c \cos \Delta\theta$$



# Displacement and change in orientation in the robot frame of reference

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Thus

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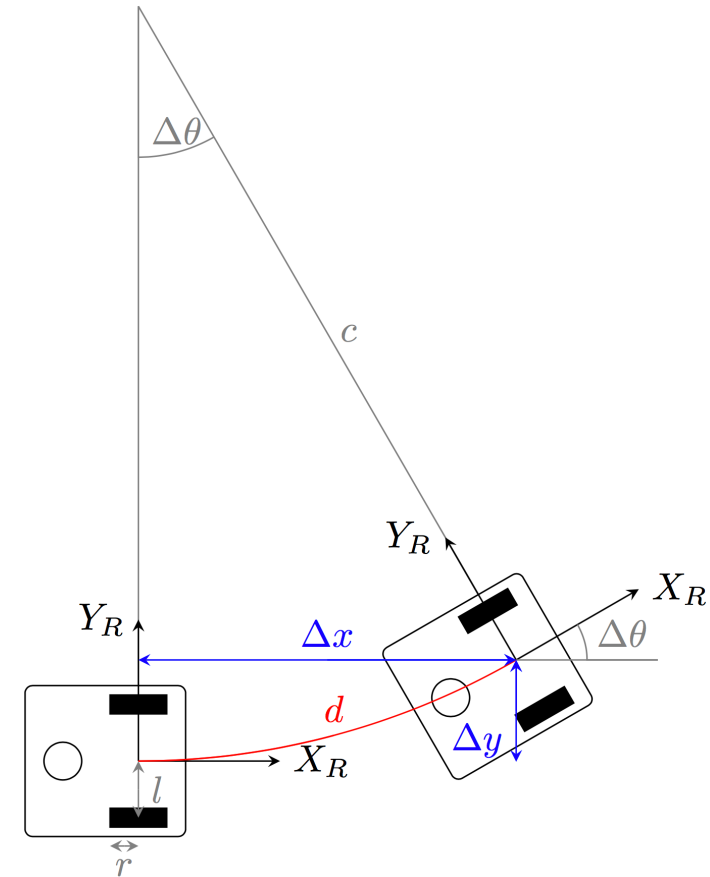
$$\Delta x = c \sin \Delta\theta$$

$$\Delta y = c - c \cos \Delta\theta$$

What happens when  $\Delta\theta \rightarrow 0$ ?

$c \rightarrow \infty$   
 $\sin \Delta\theta \rightarrow 0$   
 $1 - \cos \Delta\theta \rightarrow 0$

$\Rightarrow$  large rounding errors when computing  $\Delta x$  and  $\Delta y$   
 (and division by zero when  $\Delta\theta \equiv 0$ )



# Displacement and change in orientation in the robot frame of reference

We have two known values:

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$$\Delta\theta = \frac{r\dot{\phi}_1}{2l} + \frac{-r\dot{\phi}_2}{2l}$$

Since the angular velocities of the wheels,  $\dot{\phi}_1$  and  $\dot{\phi}_2$ , are constant,  $d$  is the length of an arc on a circle of radius  $c$  subtended by the angle  $\Delta\theta$

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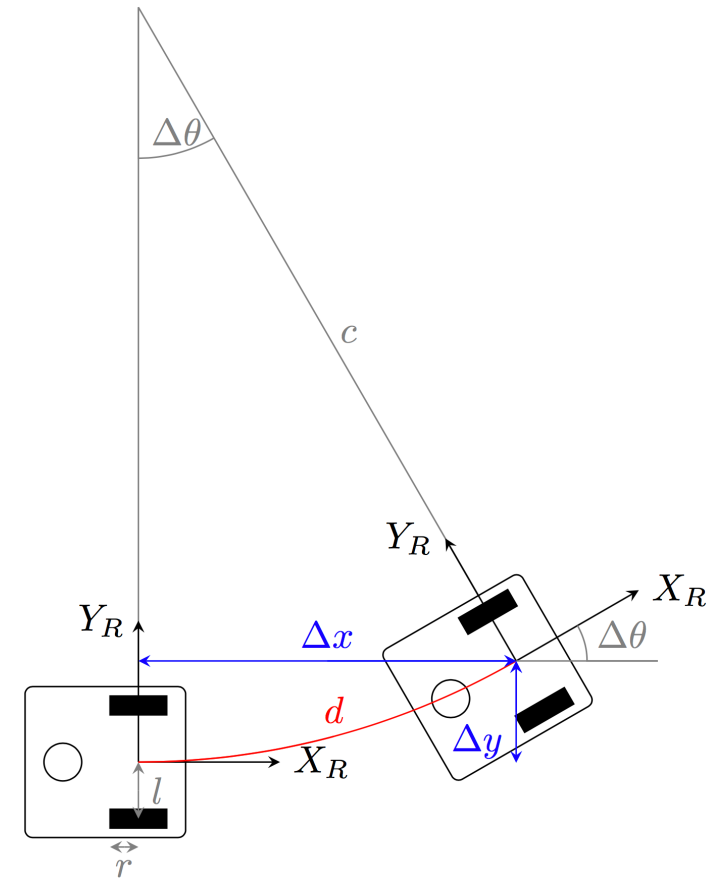
$$\Delta x = c \sin \Delta\theta$$

$$\Delta y = c - c \cos \Delta\theta$$

**Solution:**  
avoid computing  $c$   
use computationally better form:

$$\Delta x = d \frac{\sin \Delta\theta}{\Delta\theta}$$

$$\Delta y = d \frac{1 - \cos \Delta\theta}{\Delta\theta}$$



# Displacement and change in orientation in the robot frame of reference

For the case where  $\Delta\theta = 0$  or, specifically, where  $|\Delta\theta| < \text{threshold}$  use either a constant approximation:

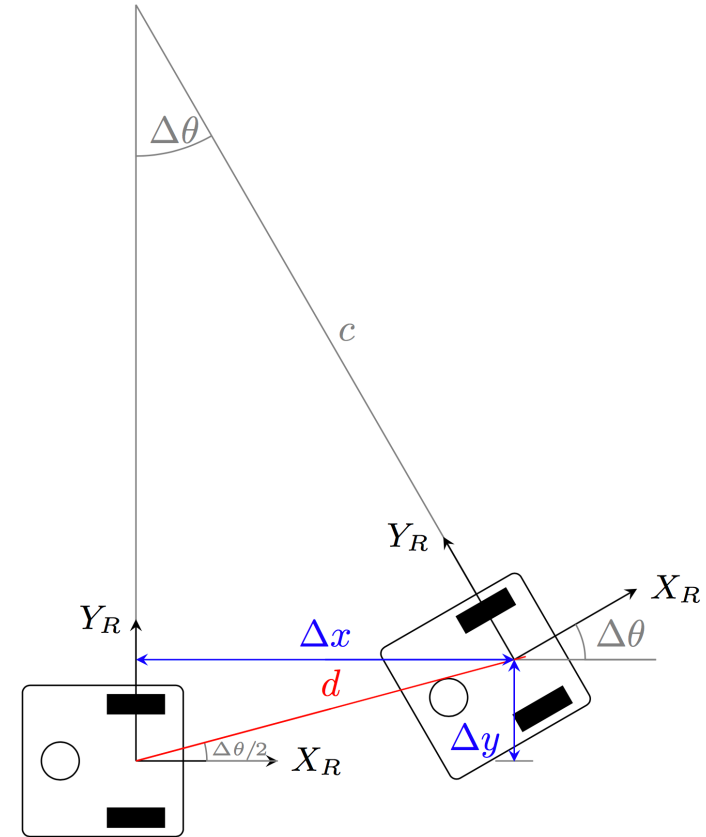
$$\Delta x = d$$

$$\Delta y = 0$$

or a functional approximation:

$$\Delta x = d \cos \frac{\Delta\theta}{2}$$

$$\Delta y = d \sin \frac{\Delta\theta}{2}$$



# Displacement and change in orientation in the robot frame of reference

For the case where  $\Delta\theta = 0$  or, specifically, where  $|\Delta\theta| < \text{threshold}$  use either a constant approximation:

$$\begin{aligned}\Delta x &= d \\ \Delta y &= 0\end{aligned}$$

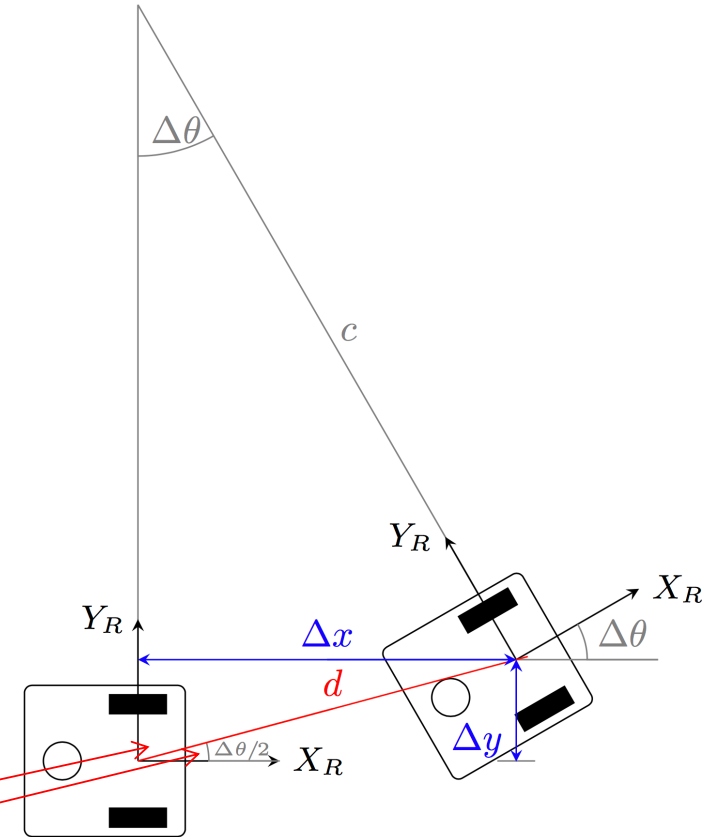
or a functional approximation:

$$\begin{aligned}\Delta x &= d \cos \frac{\Delta\theta}{2} \\ \Delta y &= d \sin \frac{\Delta\theta}{2}\end{aligned}$$

Why  $\Delta\theta/2$ ?

The isosceles triangle formed by the origins of the robot frames of reference and the instantaneous centre of rotation (ICR) has angles  $(\pi \mp \Delta\theta)/2$  at either end of its base

hence the angle here is  $\Delta\theta/2$   
i.e.  $\pi \mp (\pi \mp \Delta\theta)/2$



# Odometry-based Position Estimation

## Overall approach

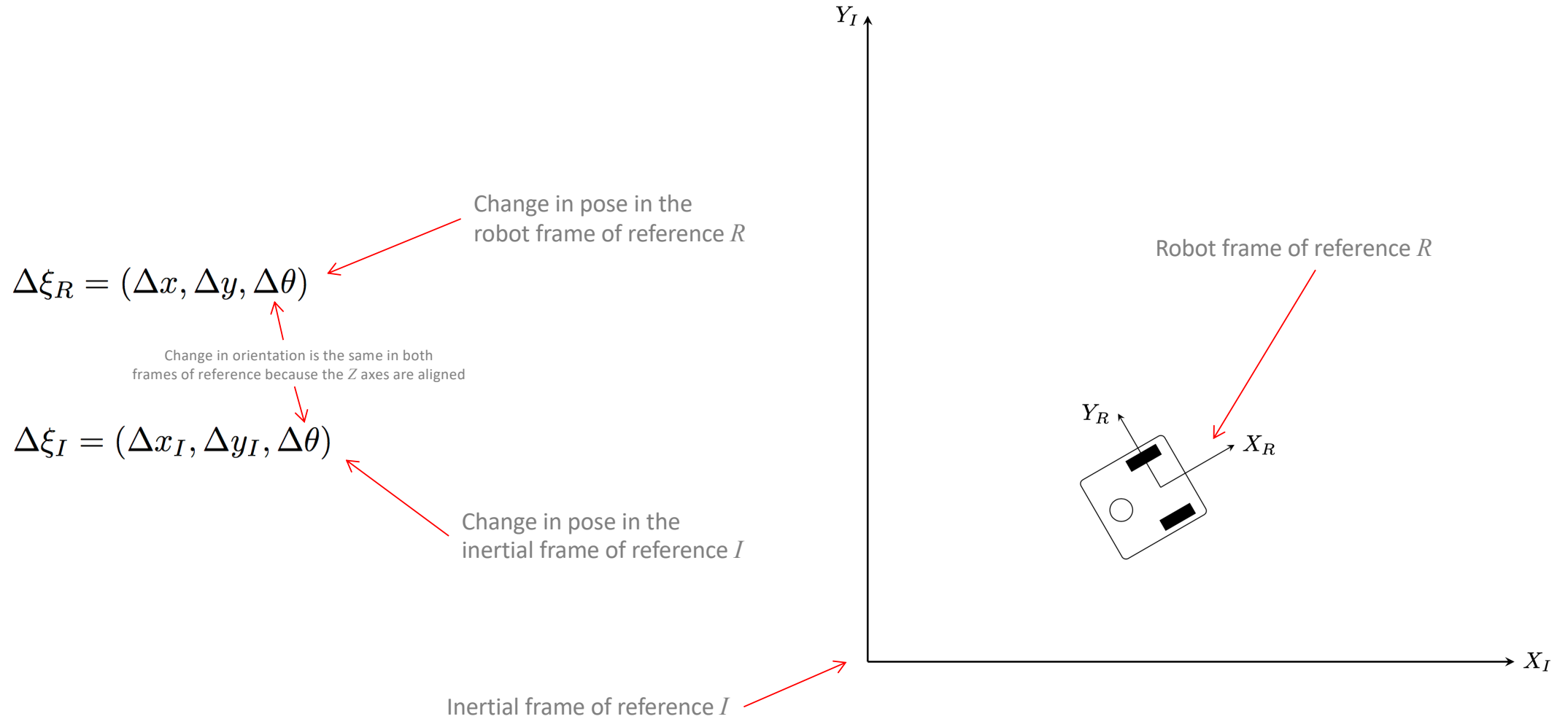
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- Repeat update (e.g. every 100 ms)

$$\Delta\xi_R = (\Delta x, \Delta y, \Delta\theta)$$



$$\Delta\xi_I = (\Delta x_I, \Delta y_I, \Delta\theta)$$

# Displacement and change in orientation in the inertial frame of reference



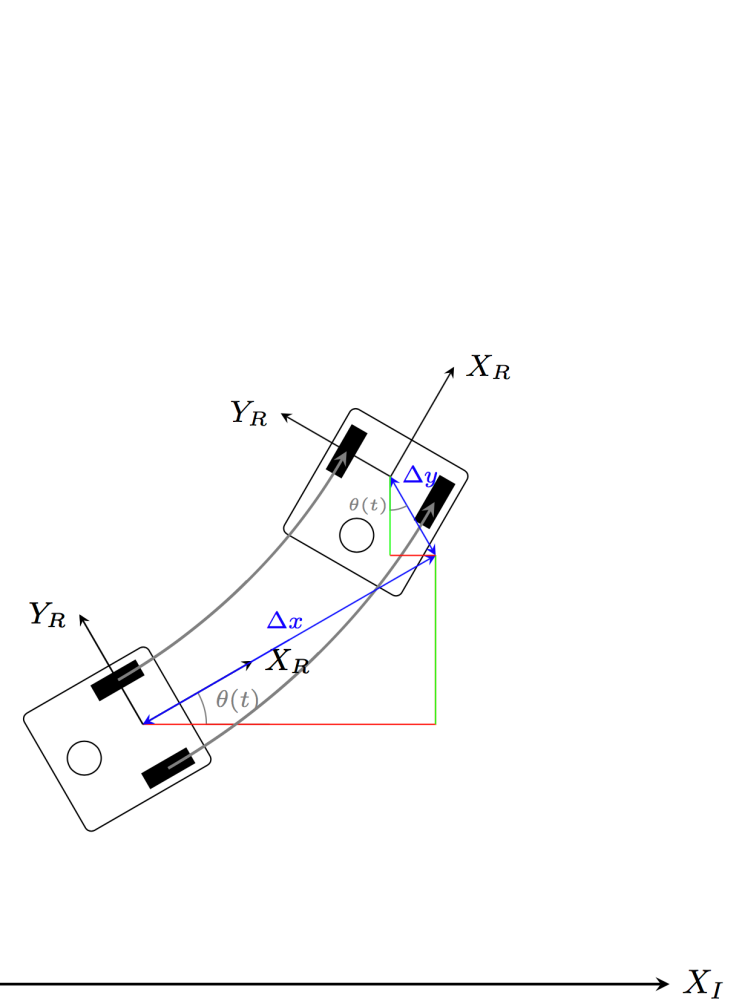


# Displacement and change in orientation in the inertial frame of reference

Orientation at time  $t$  in the inertial frame of reference

$$\Delta x_I = \Delta x \cos \theta(t) - \Delta y \sin \theta(t)$$

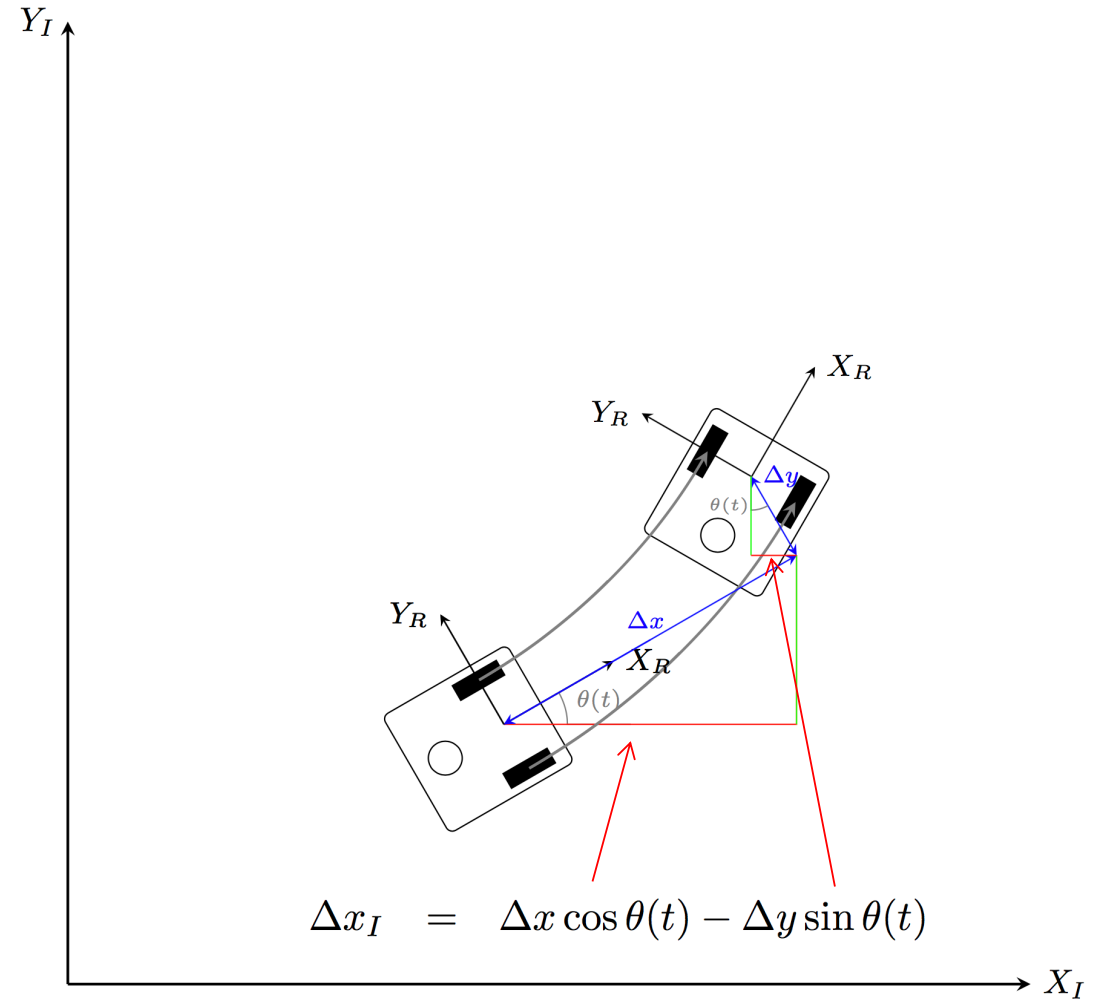
$$\Delta y_I = \Delta x \sin \theta(t) + \Delta y \cos \theta(t)$$



# Displacement and change in orientation in the inertial frame of reference

$$\Delta x_I = \Delta x \cos \theta(t) - \Delta y \sin \theta(t)$$

$$\Delta y_I = \Delta x \sin \theta(t) + \Delta y \cos \theta(t)$$



# Displacement and change in orientation in the inertial frame of reference

$$\Delta x_I = \Delta x \cos \theta(t) - \Delta y \sin \theta(t)$$

$$\Delta y_I = \Delta x \sin \theta(t) + \Delta y \cos \theta(t)$$

